

Applied Mathematics & Information Sciences An International Journal

http://dx.doi.org/10.18576/amis/180520

## A Reliability-Based Risk Analysis of a Hollow Buttress Gravity Concrete Dam

Zakaria Che Muda<sup>1,\*</sup>, Mohamed Hafez<sup>1</sup>, Lariyah Mohd Sidek<sup>2</sup>, Hidayah Basri<sup>2</sup>, Salmia Beddu<sup>2</sup>, Siti Mariam Alias Omar<sup>2</sup>, Zaher Almkahar<sup>1</sup>, and As'ad Zakaria<sup>3</sup>

<sup>1</sup> Faculty of Engineering and Quantity Surveying, INTI-International University, Nilai, Malaysia

<sup>2</sup> Institute of Energy Infrastructure, Nasional Energy University, Selangor, Malaysia

<sup>3</sup> Institute of Energy Systems, School of Engineering, University of Edinburgh, Edinburgh EH9 3FB, UK

Received: 1 Mar. 2024, Revised:15 Apr. 2024, Accepted: 2 May 2024. Published online: 1 Sep. 2024.

**Abstract:** In this paper we investigate the suitability of using first-order reliability method (FORM) analysis against a more vigorous Monte Carlo Simulation (MCS) for reliability-based analysis of the existing buttress dam in compliance with ICOLD (2005) requirements. Extreme rainfall events due to climate change critically impact the reliability and safety of the existing dams, making it an important consideration in dam risk analysis to prevent dam failure. The sliding mode is the most dominant mode of failure, and the overturning failure mode has the least significant effect. A strong linear correlation between the probability of failure and the safety factor for sliding has been established. An excellent linear correlation between the FORM-Taylor Series and Monte Carlo analysis for sliding has been obtained. The Taylor Series method is based on a simplified first-order probabilistic analysis, although somewhat conservative but adequate to be used at the preliminary design stage. The friction angle for sliding has the highest sensitivity of 94.8%, followed by the density of concrete of 4.0% and the least is the cohesion of 1.2%. The unconditional and conditional probability of failure were then evaluated against the ICOLD (2005) requirements. This study's significance indicates the FORM is too conservative to be used for the risk-based safety evaluation of the old existing hollow buttress dam at the operation stage. The Monte Carlo analysis provides a more precise form of risk analysis suitable for both the existing old dam and the new dam at the design, construction and operation stages.

Keywords: climate change, buttress dam, reliability analysis, first-order reliability method, Monte Carlo analysis.

## **1** Introduction

Buttress dams are hydraulic concrete engineering structures composed of inclined panels or arches or buttress heads that are firmly supported by buttress web. The Ambursen type buttress dam constructed in the early 1960's has a unique configuration where the upstream inclined flat slabs are situated and are supported by the corbels of the buttresses with a distinct structural arrangement. Hollow buttress dams pose less concern about uplift by foundation water pressures due to its smaller base than the gravity dams. For lateral stability, the stiffeners are incorporated as flanges with braced struts spanning between the web buttresses. The paper seeks to address the challenge of utilizing FORM (First Order Reliability Method) and MCS (Monte Carlo Simulation) for the reliability risk assessment of an aging concrete buttress dam in accordance with USBR-USACE (2019) and ICOLD (2005) guidelines.

Climate change with extreme rainfall events today leading to higher Probable Maximum Flood level plays a critical impact on the Reliability and safety of the dams, making it an important consideration in dam risk analysis (Fluixá-Sanmartín et al., 2018; Loza and Fidélis 2021; Chen and Lin, 2018; Kunkel et al., 2013; Salas et al., 2020; Sibuea et al., 2021) to meet the current USBR-USACE (2019) and ICOLD (2005) guidelines. Conversely, drought forecasting effect the operation of the hydroelectric power dam. The impacts and indices analysis of drought forecasting in Asia Continent was conducted by Khan et al. (2018).

The traditional design method for concrete gravity dams still uses the deterministic approach with a factor of safety, whereby the uncertainties associated with input variables are not directly accounted in the structural safety analysis (Pires et al., 2019). Probabilistic analyses offer a more comprehensive assessment compared to deterministic analyses with just a factor of safety owing to the incorporation of input variables with its range of standard Deviation depicting the actual set of measurements (Muench, 2010). The utilization of probabilistic techniques to assess the safety and integrity of a structural system has also been deliberated by Garcia et al. (2012). The use of safety factors for safety quantification of structures should be used cautions as the structure with the same safety factors but different coefficients of variation can have different probabilities of failure in the order  $10^{-4}$  (ICOLD, 1993). Christian et al. (1994), Tang et al. (1999), provide a clear underlying theories and examples on the use of Reliability in geotechnical engineering. Reliability analysis, on the other



hand, furnish a robust mechanism for assessing the cumulative impacts of uncertainties and offer a valuable insight of discerning situations of notably significant or insignificant uncertainties (Duncan, 2000). The design and safety check of concrete gravity dams using reliability analysis can effectively overcome the shortcomings of the safety factor method (Pei et al, 2011, Sharafati et al., 2020).

According to ICOLD (2005), risk analysis provides a pivotal tool in the risk management process. In the context of dam safety, the reliability risk analysis requires the identification of the dam potential failure modes and the quantification of probabilities of the structural responses to various loading conditions. In the context of dam block stability analysis, the First Order Reliability Method (FORM) can be used with relative ease, without additional dataset beyond the conventional analyses using the factor of safety approach. The analytical value can be significantly increases with only a modest additional computational effort (Yang and Ching, 2020). Hariri-Ardebili (2018) provides a comprehensive state-of-the-art review towards an effective risk-based probabilistic approach for dam safety. Pires et al. (2019) demonstrated the use of probabilistic risk-based analysis of a concrete gravity dam with its failure modes. The use of structural reliability methods in concrete dams is not widespread in its use in practice (Pires et al., 2019).

This research uses the FORM and MCS reliability method for the risk assessment of an aging old concrete Buttress Dam. Other techniques such as Probabilistic Density Evolution Method (PDEM) and Direct Probability Integral Method (DPIM) which is more suitable for stochastic structure system under random dynamic loads has been used for probabilistic reliability analysis. Pang et al. (2023) and Das and Tesfamariam (2023) have shown a good result when PDEM is compared with MCS. Lu, et al. (2024) has shown a precision result when DPIM is used to solve the dynamic response problems of nonlinear materials of a high concrete face rock dam. A non-intrusive random seepage method using 10,000 deterministic calculations for the high earthrockfill dam requires only 1/11 of the computation time at the 10<sup>-3</sup> failure level compared with the MCS and the error between the two methods is less than 1 % (Xu et al., 2023).

This case study aims to evaluate the probability of failure modes of the aging concrete buttress dam using the simplified FORM-Taylor series analysis against a more precise Monte Carlo Simulation (MCS) and assess its suitability to be used for risk-based safety evaluation against the USBR-USACE (2019) and ICOLD (2005) guidelines.

## 2 Reliability-Based Design Methods

The reliability-based analysis of a typical cross-section of the RCC dam is analyzed by First Order Reliability Method (FORM) using first-order Taylor series approximation and compared with a more complex Monte Carlo Simulation (MCS) approach. FORM-Taylor Series approximation is mathematically simpler, though somewhat less precise, that

can be performed using an excel spreadsheet that is used by the design practitioners. MCS which is coded in MATLAB provides a more rigorous and precise analysis which is suitable for construction and operation stage assessment and a research-based environment.

#### 2.1 First-Order Reliability Method (FORM)

First-Order Reliability Method (FORM)" originates from the approximation of the performance function g(X) by the linearization of first-order Taylor expansion.

A performance function or limit state function, g(x) is defined as the failure state (g(x) < 0) and safety state (g(x) > 0) where  $x = (x_1, x_2..., n)$  is a random variable vector.

The performance function (Phoon, 2019) is widely adopted:

$$g(\mathbf{x}) = g(x_1, x_2..., n) = F_s(x_1, x_2, ..., x_n) - 1.0$$
(1)

where  $F_s$  is the factor of safety and the prescribed acceptable safety factor is 1.0 (Liang et al., 1999).

The probability of failure can be defined as

$$Pf_{\text{FORM}} = P(g(\mathbf{x}) < 0) = \int g(\mathbf{x}) \le 0 f(\mathbf{x}) \, \mathrm{d}\mathbf{x}$$
 (2)

where f(x) is the joint probability density function of x.

Due to the inherent complexity of the multidimensional integral in equation (2), the reliability index  $\beta$  is typically computed in engineering practice and the failure probability is subsequently estimated by

$$Pf_{\text{FORM}} \approx \Phi(-\beta) = 1 - \Phi(\beta)$$
 (3)

where  $\Phi\left(\cdot\right)$  is the standard normal cumulative distribution function.

Since FORM only gives a linear approximation of the limitstate function at the design point, the reliability index may be over- or underestimated for the functions with considerable curvature as such Monte Carlo Simulation provide a more accurate solution for a multi-number of the variable of a large complex model with non-linear limit state functions.

### 2.2 Monte Carlo Simulation

Monte Carlo simulation (MCS) provides a versatile approach capable of solving large complex models with multi-variables, whether linear or nonlinear of single or multiple limit state functions. This method involves sample trials of random variables, taken from the joint density function f(x) in Equation 2. The probability of failure is then estimated as in Equation 4.

$$P_{fMCS} = \frac{1}{N} \sum_{i=1}^{N} I[X_i] = \frac{N_f}{N}$$

$$\tag{4}$$

where  $P_{\rm fMCS}$  is the estimated probability of failure. I[] denotes the indicator function, Xi represents the sample vector i, Nf signifies the points within the failure domains, and N stands for the total number of trials. The number of trials must be sufficiently large to attain a precise estimation of the probability of failure with minimum statistical errors.

(5)

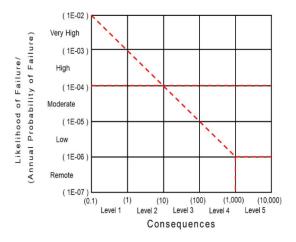
$$I(Xi) = \begin{cases} 1 \text{ if } g(x) \le 0 \\ 0 \text{ if } g(x) > 0 \end{cases}$$

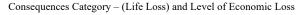
Finally, the MCS-based reliability index is expressed as:

$$\beta_{\text{MCS}} \approx - \Phi^{-1} \left( P f_{\text{MCS}} \right) = \Phi^{-1} \left( 1 - P f_{\text{MCS}} \right)$$

## **3** Tolerable Risk Guidelines

A risk matrix provides a valuable tool for the likelihood of failure and the consequences arising from identified risk drivers associated with significant potential failure modes. In Figure 1, a dam risk matrix is depicted, employing general categories of failure likelihood and severity of the consequence.





#### Fig. 1: Dam Risk Matrix (USBR-USACE, 2019)

The vertical axis of the matrix delineates the likelihood of failure and the annual probability of failure (APF), while the horizontal axis delineates the corresponding consequences, including loss of life and economic impacts categorized as follows: Level 1 <\$10 million, Level 2 \$10-\$100 million, Level 3 \$100-\$1 billion, Level 4 \$1-\$10 billion, and Level 5 >\$10 billion (USBR-USACE, 2019). However, further studies need to be carried out on the life and economic loss as a consequence of the probability of failure associated with the dams. ICOLD (2005) uses the horizontal dashed line value for the probability of failure of  $10^{-4}$  for the high-risk dams.

For existing dams, the APF for an individual risk to the identifiable person or group, defined by a location should be limited to the value of less than  $10^{-4}$  per year, except in exceptional circumstances (ANCOLD, 2003). The USACE (2014) policy for the estimated APF of greater  $10^{-4}$  per year is unacceptable except in exceptional circumstances with the justification to implement risk reduction actions. If the APF is less than  $10^{-4}$  per year, the other tolerable risk guidelines are met, and the implementation of the risk reduction actions diminishes.

# 4 Buttress Gravity Concrete Dam – A Case Study

The hollow buttress dam's typical cross-section of the buttress hollow spillway and its forces are shown in Figure 2.

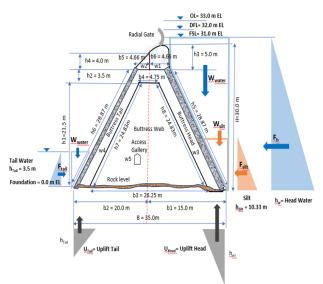


Fig. 2: A typical cross-section of the buttress hollow spillway and its forces

In the analysis, the assumption is that the exterior load on the slab is directly transferred to the buttresses and cohesion forces are subsequently transferred from the slab to the bedrock trench. The uplift pressure is exerted beneath the whole front plate and also beneath the 'thick' buttress web. If the thickness of web "t" is bigger than 2 m, the uplift reduction must be considered over a distance of "t/2" else if web "t" is less than 2 m, uplift is applied only for a whole front plate with no uplift under the buttress web.

#### 4.1 Design Data of Hollow Buttress Dam

The design data of the aging hollow buttress dam which was constructed in the early 1960's is given in Table 1.

Table 1. Design Data of the Dall					
General	SI units				
Full supply level (FSL)	31.00 m EL				
Design flood level (DFL)	32.00m EL				
Overtopping level (OL) – PMF	33.00m EL				
level					
Silt level - assumed 1/3 of FSL level	10.33m EL				
Foundation level	00.00m EL				
Width of base	35.0 m				
Thickness of the buttress web	2.0 m				
Spacing of the buttress web -	7.5 m				
centre to centre					

Table 1: Design Data of the Dam

#### 4.2 Variability of Design Parameters

Variable material parameters involved in the reliability risk



analysis of gravity dam include the density of concrete, shearing friction coefficient and cohesion of dam concreterock interface. Volume weight of concrete, friction angle and cohesion were determined by site-specific laboratory test samples. The sample size must meet the statistical requirements and be treated as a random variable (Xin and Chongshi, 2016).

Economic and safety reasons made it desirable to use the actual site-specific values of shear strength and uplift based on the actual monitoring system rather than generic values as specified in the guidelines for concrete dam stability analyses. The use of instrumented measured uplift and shear strength with thorough knowledge of site geology will reduce the uncertainty in stability evaluations of the risk analysis and economic cost. Uplift pressures over the maximum design have been reported in some dams (Spross, J. et al., 2014). Degradation phenomena in dam-foundation contacts have been also reported in some cases that are needed for remedial actions (Barpi, F. and Valente, S., 2008).

#### 4.2.1 Density of Concrete Material

CIB (1991) gives a mean value of 23.5 kN/m<sup>3</sup> with a standard deviation,  $\sigma$  of 0.940 kN/m<sup>3</sup> or the coefficient of variation (COV) of 0.04 for concrete of compressive strength 20 MPa, and 24.5 kN/m<sup>3</sup> with a standard deviation,  $\sigma$  of 0.735 kN/m<sup>3</sup> or COV = 0.03 for concrete of compressive strength greater than 40 MPa. Assume the compressive strength for the buttress dam is 40MPa.

## 4.2.2 Friction Angle Parameters of Concrete to Rock and Concrete to Concrete Interface

Category II rock mass of medium sound was adopted with the friction angle,  $\phi$  with the value of 50.0° and standard Deviation,  $\sigma$  of 13.26° and cohesion, C of 1.2 MPa and  $\sigma$  of 0.44 MPa. These pro-rated values are based on the China Electric Council (2010) recommendation for the rockconcrete interface at the foundation level as given in Table 2.

#### 4.3 Load Cases

The load case events adopted in the analyses are as follows;

- 1. Usual Load Case: Full supply level (FSL) with AEP of 1
- 2. Unusual Load Case: Design Flood Level (DFL) with AEP of 1:1,000
- 3. Extreme Load Case: Overturning Level (OL) at PMF level with AEP of 1:10,000

The unusual load case at the DFL of an old existing dam constructed in the early 1960's was designed with a yearly probability of 1:1,000. The extreme load case due to PMF for OL need to be checked with an AEP of 1:10,000 for safety requirements as required by ICOLD (2005).

The assumed silt and tail-water level is 10.33 m and 3.5 m

respectively for all load cases under FSL, DFL and OL conditions.

The reliability-based using FORM-Taylor Series Approximation and Monte Carlo Simulation (MCS) are carried out based on the above conditions to determine the annual probability of failure for the sliding and overturning failure modes that are applied to the RCC dam main spillway section.

## **5** Methodology

Two methods of reliability risk analysis - the simplified FORM with Taylor Series approximation and Monte Carlo analysis - have been used in this paper. The first Taylor Series method is a probabilistic simplified analysis, though somewhat less precise, and was used by USACE (1997 and 1998) and Duncan (2000). The second Monte Carlo probabilistic analysis was carried out using a 10 million sample population provides a more rigorous and precise form of analysis than the FORM-Taylor Series method.

## 5.1 Reliability-based analysis using FORM-Taylor Series Approximation.

A simplified reliability analysis using the FORM-Taylor series approximation as proposed by Duncan (2000) is carried out for the RCC concrete dam for the stability checks against sliding and overturning, mathematically simpler, though somewhat less precise but adequate for design practice, that can be performed using excel spreadsheet. The terms involved in computing the sliding factor of safety FOS [C,  $W_{concrete}$ , tan  $\phi$ ] and overturning factor of safety FOS [W\_{concrete}] all involve some degree of uncertainty. Therefore, the computed value of the sliding and overturning factor of safety also involves some uncertainty.

 Table 2: Friction Angle and Cohesion Parameters of Rock

 Interface

Rocks properties of dam foundation	Friction angle $\phi^{\circ}$		Cohesion C, MPa	
	Mean	Standard Deviation, s	Mean	Standard Deviation, s
Category I: dense and sound,		16.70	1.5	0.54
the distance between cracks $> 1$	52.43	14.57	1.3	0.47
m				
Category II: sound, weakly		14.57		0.47
weathered massive rock with	47.73	11.86	1.1	0.40
crack spaces distance between				
0.5-1m				
Category III: Rock mass of		11.86		0.40
medium sound with crack	41.99	11.31	0.7	0.28
spaces distance between 0.3-				
0.5m				

It is useful to be able to assess the Reliability of sliding and overturning factors of safety, as well as the best estimate of its value. Therefore, the computed value of the sliding and overturning factor of safety also involves some uncertainty. It is useful to be able to assess the Reliability of sliding and overturning factors of safety, as well as the best estimate of its value. The calculation steps using the reliability-based FORM-Taylor Series approximation are as follows:

Step 1. Determine the most likely values of the parameters involved and compute the factor of safety by the normal (deterministic) method for sliding and overturning. This is sliding  $F_{MLV}$  or overturning  $F_{MLV}$ .

$$F_{MLV} = \frac{\{CA + (\Sigma W_{conc} + \Sigma W_{water} + \Sigma W_{silt} - \Sigma U_{uplift}) \tan \emptyset\}}{F_h + F_{silt} - F_{tail}}$$
(5)

$$F_{MLV} = \frac{\{\Sigma W_{conc} \cdot x_{conc} + \Sigma W_{water} \cdot x_{water} + \Sigma W_{silt} \cdot x_{silt} + F_{tail} \cdot \frac{h_{tail}}{3}\}}{F_h \cdot \frac{h_w}{3} + F_{silt} \cdot \frac{h_{silt}}{3} + \Sigma U_{uplift} x_u}$$
(6)

The above deterministic analysis using the above factor of safety can be easily extended into the first-order reliability analysis using first-order Taylor Series approximation.

Step 2. Estimate the mean and standard deviations of the parameters that involve uncertainty. i.e., angle of friction,  $\phi$  and Density of concrete,  $\gamma_{conc}$  are considered as random variables with normal distributions.

- 1 CIB (1991) gives the concrete Density,  $\gamma_{conc}$  of a mean value of 24.5 kN/m<sup>3</sup> with a standard deviation,  $\sigma$  of 0.735 kN/m<sup>3</sup> for concrete of compressive strength of 40 MPa.
- 2 China Electric Council (2010) Category III rock mass of medium sound with the friction angle value,  $\phi$  of 50.0° and standard deviation,  $\sigma$  of 13.26° and cohesion value, C value of 1.19 MPa and standard Deviation,  $\sigma$  of 0.24 MPa.

Step 3. Use the Taylor series technique (Wolff, 1994; USACE 1997, 1998 and Duncan, 2000) to estimate the standard Deviation and the coefficient of variation of the factor of safety for cohesion, weight of concrete and friction angle using these formulas:

$$\sigma_F = \sqrt{\left(\frac{\Delta F_1}{2}\right)^2 + \left(\frac{\Delta F_2}{2}\right)^2 + \left(\frac{\Delta F_3}{2}\right)^2} \tag{7}$$

$$V_F = \frac{\sigma_F}{F_{MLV}} \tag{8}$$

Compute the factor of safety with each parameter increased by one standard Deviation and then decreased by one standard Deviation from its most likely value, with the values of the other parameters equal to their most likely values. These calculations result in N values of  $F^+$  and N values of  $F^-$ . Using these values of  $F^+$  and  $F^-$ , compute the values of  $\Delta F$  for each parameter and compute the standard Deviation of the factor of safety ( $\sigma_F$ ) using (7) and the coefficient of variation of the factor of safety ( $V_F$ ) using (8). To calculate  $\beta$ , the First Order Reliability Method (FORM) method uses a Taylor series expansion as above, simplified by using only the first term (hence, "First Order").

Step 4. Use an Excel spreadsheet to determine the value of FMLV from the first step and the value of VF from the third step to determine the value of Pf. The key to computing more precise values of P<sub>f</sub> is to compute the value of the lognormal reliability index,  $\beta_{LN}$ , using the following formula (Scott et

al. 2001):

$$\beta_{LN} = \frac{\ln (F_{MLV} / \sqrt{1 + V^2})}{\sqrt{\ln(1 + V^2)}}$$
(9)

where  $\beta_{LN} =$  lognormal reliability index; V = coefficient of variation of a factor of safety; and  $F_{MLV} =$  most likely value of factor of safety.

Step 5 When  $\beta_{LN}$  has been computed using (9), the value of  $P_f$  can be determined accurately using the built-in function NORMSDIST in Excel. The argument of this function is the reliability index,  $\beta_{LN}$ . In Excel, under "Insert Function," "Statistical," choose "NORMSDIST," and type the value of  $\beta_{LN}$ .

The excel spreadsheet output of the Reliability-based analysis using FORM-Taylor Series approximation for a design flood level case is given in Appendix 1.

## 5.2 Reliability-based analysis using Monte Carlo Simulation

A practical alternative is to develop probability distributions for the various parameters and apply a more rigorous Monte Carlo Simulation (MCS) with a higher degree of accuracy to determine the probability that the safety factor is below some threshold value associated with instability or other types of bad performance.

The basic procedure using the Monte Carlo analysis coded in Matlab for the buttress concrete dam is listed below:

Step 1 Build a probabilistic model of limit state analysis for a safety factor for sliding and overturning moment as given in Equations 5 and 6, respectively.

Step 2 Assign the mean and probability distributions to the model inputs for uncertainty in material properties, i.e., angle of friction  $\phi$  and Density of concrete,  $\gamma_{conc}$  are considered random variables with normal distributions with no correlation.

- 1 CIB (1991) gives a concrete density of a mean value of 24.5 kN/m<sup>3</sup> with a standard deviation of 0.735 kN/m<sup>3</sup> for concrete of compressive strength of 40 MPa.
- 2 China Electric Council (2010) Category II rock mass of medium sound with a friction angle value of  $50.0^{\circ}$  with standard Deviation,  $\sigma$  the value of  $13.26^{\circ}$ , and cohesion, C of 1.2 MPa with  $\sigma$  a value of 0.44 MPa were used for the concrete dam foundation concrete-rock interface.

Step 3 Sample the model inputs based on their normal distributions and constraints using the 3-sigma rule.

Step 4 Input all the constant or determinate values.

Step 5 Run the model for the safety factor for sliding and overturning.

Step 6 Record the model output factor of safety.

Step 7 Repeat for the specified samples of the model inputs. Ten million input samples are used.





Step 8 Compute the number of samples with the factor of safety < 1.0; however, the safety factor is a constraint to be greater than zero.

Step 9 Evaluate the probability distribution for the model outputs with  $N=10^6$ .

$$P_f = \frac{1}{N} \sum_{i=1}^{N} I[X_i] = \frac{N_f}{N}$$
(10)

Probability of Failure = No of samples with the factor of safety < 1.0 / Total No of Samples.

```
for i=1:MCS_Sample
W_Concrete(i) =
Area_of_Concrete*Density_of_Concrete_distribu
tion(i);
Sliding_FOS(i) =
((Cohesion distribution(i)*Area of Contact+((
W_Concrete(i)+W_Water+W_Silt-
Total_Uplift_Force)
*tand(Friction_Angle_distribution(i))))
/((Horizontal_Hydraulic_Force_Upstream+Horizo
ntal_Force_Silt-
Horizontal_Hydraulic_Force_Downstream));
end
FOS_Below_One = nnz(Sliding_FOS<1);</pre>
Probability_of_Failure =
FOS_Below_One/MCS_Sample;
```

Matlab Code for Sliding Mode of Failure

Matlab Code for Overturning Mode of Failure

```
for i=1:MCS Sample
   W_Concrete(i) =
Volume_of_Concrete*Density_of_Concrete_distr
ibution(i);
    Overturning_FOS(i) =
(Cohesion_distribution(i)*Area_of_Contact+(W
_Concrete(i)*Lever_arm_Xconcrete)+(W_Water*L
ever_arm_Xwater)+(W_Silt*Lever_arm_Xsilt))/(
(Horizontal_Hydrostatic_Force_Upstream*Lever
_arm_Ywater_Upstream)+(Horizontal_Force_Silt
*Lever_arm_Ysilt)+Total_Uplift_Moment-
(Horizontal_Hydrostatic_Force_Downstream*Lev
er_arm_Ywater_Downstream));
end
FOS Below One = nnz(Overturning FOS<1);</pre>
Probability_of_Failure =
FOS_Below_One/MCS_Sample;
```

Step 10 Calculate the Reliability Index.  $\beta$ . Set  $\beta > 8$  if the number of samples with a safety factor < 1.0 is zero, i.e., probability of failure = 0.

Matlab Code for Reliability Index

```
% Calculate the reliability index (Beta) using
the inverse CDF of the standard normal
distribution
Beta = -norminv(Probability_of_Failure);
```

Step 11 Display the output and plot the number of samples against the safety factor graph.

The output file from the MCS analysis for the sliding and overturning failure modes for the design flood level case is given in Appendix 2.

## **6** Results and Discussion

The concrete gravity dam's two predominant probabilities of failures – sliding and overturning modes have been analyzed and discussed in this section.

## 6.1 Factor of Safety, Probability of Failure, and Reliability Index Concrete-Foundation Level

The hollow section between the buttresses is open to the outside air and, as such, does not experience any extreme uplift condition. Only the buttress head and tail at the slab wall have an uplift pressure.

The summary of the hollow spillway section results for sliding, overturning, and FORM-Taylor Series and Monte Carlo simulation probability of failure is shown in Table 3.

The above sliding factor of safety for full supply level (FSL), design flood level (DFL), and overtopping level (OL) are compared with the minimum sliding factor of safety for usual, unusual, and extreme flood is 2.0, 1.5, and 1.3 respectively for a well-defined friction and cohesion present as given Table C.8 of MyDAMS (2017). The sliding safety factor of 2.24 at FSL is higher than 2.0 for well-defined conditions with 80% confidence on test data where friction and cohesion are present. The sliding safety factor for DFL (2.11) and OL (2.00) is greater than 1.5 and 1.3, respectively.

The above sliding factor of safety for full supply level (FSL), design flood level (DFL), and overtopping level (OL) are compared with the minimum sliding factor of safety for usual, unusual, and extreme flood is 2.0, 1.5, and 1.3 respectively for a well-defined friction and cohesion present as given Table C.8 of MyDAMS (2017). The sliding safety factor of 2.24 at FSL is higher than 2.0 for well-defined conditions with 80% confidence on test data where friction and cohesion are present. The sliding safety factor for DFL (2.11) and OL (2.00) is greater than 1.5 and 1.3, respectively.

The FSL has the highest sliding reliability index ( $\beta_{TS} = 1.406$ ,  $\beta_{MCS} = 1.658$ ), and OL has the lowest ( $\beta_{TS} = 1.173$ ,  $\beta_{MCS} = 1.441$ ). In the Monte Carlo Simulation (MCS), the number of samples run is 10 million, and zero failure is recorded when  $\beta > 7.87375$ , i.e.,  $P_f = 00.000E+00$ .

The FSL has the highest overturning reliability index ( $\beta_{TS} = 54.150$ ,  $\beta_{MCS} > 8$ ), and OL has the lowest ( $\beta_{TS} = 48.6042$ ,  $\beta_{MCS} > 8$ ). In the MATLAB coding for MCS, the operational limit for no likelihood of failure is set at  $\beta > 8$ .

The no likelihood of the probability of overturning failure in the FORM-TS is similar to MCS values. There is no probability of overturning failure ( $P_{\text{fTS}} = 00.000\text{E}+00$ ,  $P_{\text{fMCS}} = 00.000\text{E}+00$  for all the events under FSL, DFL, and OL.

Figure 3 indicates the sliding factor of safety and reliability index  $\beta$  for the FORM and Monte Carlo.

The safety factor for sliding follows the same trend line as

the reliability index,  $\beta_{TS}$  of FORM-Taylor Series, and  $\beta_{MCS}$  of MCS.  $\beta_{MCS}$  values of MCS are higher than  $\beta_{TS}$  values of the FORM-Taylor Series.

However, no direct comparison or trend between the reliability index,  $\beta$  TS for FORM-Taylor Series, and  $\beta$  MCS for MCS can be established. In the MATLAB coding for MCS, the operational limit where no probability of failure occurs is set as  $\beta > 8$ , i.e.,  $P_f = 00.000E+00$ .

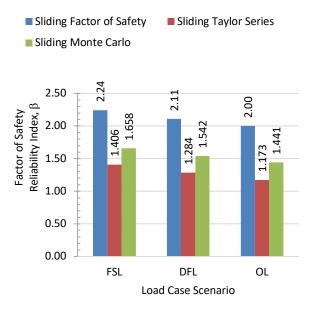
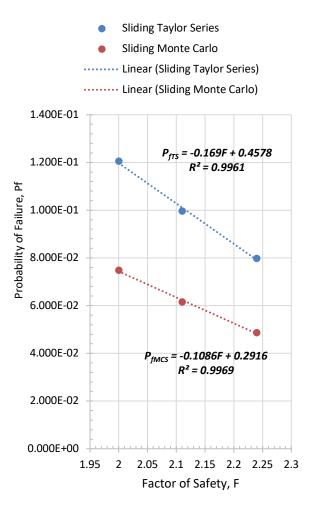


Fig. 3: Sliding Factor of Safety and Reliability Index  $\beta$ 

Figure 4 shows the relationship between the probability of failure  $P_f$  and sliding factor of safety, F for FORM-Taylor Series and Monte Carlo Simulation.



1167

**Fig. 4:** Relationship between the Sliding Probability of Failure P<sub>f</sub> and Factor of Safety, F

 Table 3: Sliding and Overturning Factor of Safety and Probability of Failure of Buttress Dam

			Sliding			Overturnin	g	
Load Case Scenario	h <sub>w</sub> (m)	h <sub>tail</sub> (m)	Sliding F <sub>MLV</sub>	Taylor Series $P_f$ ( $b_{TS}$ )	Monte Carlo $P_f$ ( <i>b</i> <sub>MCS</sub> )	$\begin{array}{l} Overturn-\\ ing \ F_{MLV} \end{array}$	Taylor Series $P_f$ ( $b_{TS}$ )	Monte Carlo $P_f$ ( <i>b</i> <sub>MCS</sub> )
Full Supply Level Usual Event	31.0	3.5	2.24	7.981E-02 (1.406)	4.863E-02 (1.658)	2.82	0.00E+00 (54.150)	0.00E+00 (>8)
Design Flood Level Unusual Event	32.0	3.5	2.11	9.965E-02 (1.284)	6.152E-02 (1.542)	2.65	0.00E+00 (51.364)	0.00E+00 (>8)
Overtopping Level Extreme Event	33.0	3.5	2.00	1.205E-01 (1.173)	7.477E-02 (1.441)	2.48	0.00E+00 (48.604)	0.00E+00 (>8)

FSL is full supply level, DFL is design flood level, OL is overtopping level,  $h_w$  is upstream head of water, and  $P_f$  Probability of Failure and b Reliability Index are given in bracket.



The results indicate a very strong linear correlation between the probability of failure  $P_f$  and sliding factor of safety, F with  $R^2 > 0.96$  for both FORM-Taylor Series and Monte Carlo Simulation with the following relationship;

• FORM-Taylor Series

 $P_{fTS} = -0.169F + 0.9961$  with  $R^2 = 0.9961$  (11)

Monte Carlo Simulation

 $P_{fMCS} = -0.1086F_S + 0.2916$  with  $R^2 = 0.9969$  (12)

The probability of failure  $P_f$  decreases linearly with the increase in the safety factor, F, for both the FORM-Taylor Series and Monte Carlo analysis. The FORM-Taylor Series,  $P_{fTS}$  is higher than the Monte Carlo probability of failure  $P_{fMCS}$  for the given sliding factor of safety.

Figure 5 shows the sliding probability of failure  $P_f$  for FORM-Taylor Series and Monte Carlo Simulation and their normalized values.

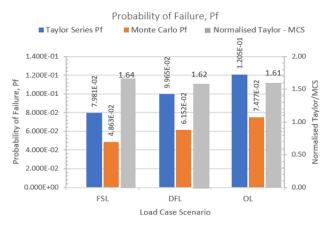


Fig. 5: Sliding Probability of Failure, Pf and

Normalized Taylor Series-Monte Carlo Values

It is interesting to note that the risk probability of failure for a DFL event is lower than for FSL and OL events due to the stabilizing effect of the tail-water force against the destabilizing headwater effect on the horizontal forces. The normalized FORM-Taylor to MCS probability of failures  $P_f$  values ranges from 1.61 to 1.64 with an average value of 1.625.

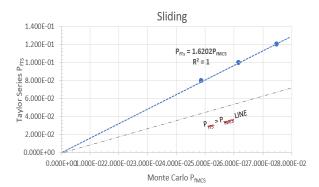
Figure 6 illustrates the correlation between the FORM-Taylor Series and Monte Carlo analysis for the sliding probability of failure.

The results indicate an excellent linear correlation between the FORM-Taylor Series,  $P_{fTS}$ , and Monte Carlo analysis  $P_{fMCS}$  for sliding with  $R^2=1$  with the following relationship.

$$P_{fTS} = 1.6202 P_{fMCS}$$
 (13)

FORM-Taylor Series,  $P_{fTS}$  values are 1.62 times more conservative than Monte Carlo analysis  $P_{fMCS}$  for sliding as given in the above correlation equation. Thus, FORM-Taylor probability values are too conservative in evaluating the risk on the probability of failure than the more precise MCS reliability analysis of the existing old concrete buttress dam.

No direct comparison can be made between the reliability indexes,  $\beta_{TS}$  for FORM-Taylor Series, and  $\beta_{MCS}$  MCS. In the MATLAB coding for MCS, the operational limit where no probability of failure occurs is set at  $\beta > 8$ , i.e.,  $P_f = 00.000E+00$ .



**Fig. 6:** Sliding Probability of Failure – Correlation between FORM-TS and Monte Carlo Analysis

From the reliability analysis, the sliding failure mode was the dominant mode over the overturning mode of failure. The most probably been friction angle is the most influential random variable in this failure mode. The overturning had a significantly lower probability of occurrence than sliding. The overturning modes had a very low probability of occurrence, the reason being that the stabilizing weight of concrete with only a negligible destabilizing uplift force for the buttress dam.

The calculation results indicate that FORM is too conservative than MCS to be used for the probabilistic riskbased analysis as a reference for the design of the buttress concrete dam for sliding failure mode. At no likelihood of overturning failure, FORM and MCS have the same probability value. FORM can only be adequately used at the preliminary design stage for the buttress dam reliability risk analysis. A more precise Monte Carlo Simulation is recommended to be used as a reference for the concrete buttress dam's design, construction and operation stage.

#### 6.2 Sensitivity Analysis

Sensitivity analysis measures how the impact of one or more input variables can lead to uncertainties in the output variables. Table 4 and Figure 7 indicate the sensitivity analysis on the independent input variable friction angle, cohesion and concrete Density for sliding. No sensitivity analysis is carried out for overturning as it has only one input variable, i.e., density of concrete.

 $\Delta F$  values measure the swing on the safety factor for the friction angle, cohesion, and the density of concrete taken from the FORM-Taylor Series analysis for sliding, as shown in Appendix 1.

The friction angle swing  $\Delta F$  ranges from 2.07 to 2.32, cohesion swing  $\Delta F$  ranges from 0.0257 to 0.0288, and concrete swing F's Density ranges from 0.0865 to 0.0978. The sensitivity for the friction angle is 94.8%, the density of concrete is 4.0%, and cohesion is 1.2%. The sliding mode of failure is very sensitive to friction angle and less sensitive to the density of concrete and cohesion. In this sense, the Taylor Series Method can be viewed as a structured sensitivity analysis or parametric study.

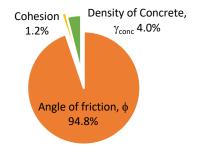


Fig. 7: Sensitivity Analysis for Sliding

## 6.3 Unconditional Probability of Failure

The annual exceedance probability (AEP) for full supply level (FSL) under usual operating conditions and design flood level (DFL) and overtopping level (OL) is assumed to be 1,  $10^{-3}$ , and  $10^{-4}$ .year<sup>-1</sup> respectively.

 $\begin{array}{l} \textit{Unconditional probability of failure, } \textit{P} f_{\textit{unconditional}} = \\ \sum \textit{P} f_{\textit{conditional}} \ge \sum \textit{P} f_{\textit{water level}} \end{array}$ (14)

The conditional probability of failure provides insights into the susceptibility of a dam to specific triggers, while the unconditional probability of failure offers a broader assessment of the overall failure likelihood. These probabilities assist in prioritizing risk management strategies, determining maintenance needs, and making informed decisions regarding dam safety measures. Table 5 shows the results of the sliding unconditional probability of failure for the FORM-Taylor Series and Monte Carlo simulation.

All the sliding combined or unconditional probability of failure under DFL and OL cases is less than 1.0 x  $10^{-4}$  (ICOLD, 2005) except for FSL. The highest is under FSL (P<sub>fTS</sub>= 7.981-02, P<sub>fMCS</sub>= 4.863E-02) and lowest is under OL (P<sub>fTS</sub>= 1.205E-05, P<sub>fMCS</sub>= 17.477E-06). This uncertainty can be further reduced by accurate and extensive in situ testing, and accounting for the buried part of the slab in the foundation, the calculated reliability index can be further increased.

The unconditional and conditional probability of failure for overturning is 00.00E+00. As such, there is no likelihood of the overturning probability of failure for the hollow buttress dam for all the load cases.

		• ·= · · · · · · · · · · · · · · · · · ·				
Full Sup	ply Level	Design Flo	od Level	Overtopping	g Level	Average
(FSL)		(DFL)		(OL)		
Swing	Sensitivity	Swing DF	Sensitivity	Swing	Sensitivity	Sensitivity
DF	%	-	%	DF	%	%
2.32	94.8	2.19	94.8	2.07	94.8	94.8
0.0288	1.2	0.0272	1.2	0.0257	1.2	1.2
0.0978	4.0	0.0919	4.0	0.0865	4.0	4.0
	(FSL) Swing DF 2.32 0.0288	Full (FSL)Supply LevelSwing DFSensitivity %2.3294.80.02881.2	FullSupplyLevelDesignFlo(FSL)(DFL)(DFL)SwingSensitivitySwing DFDF%2.190.02881.20.0272	Full (FSL)Supply LevelLevel (DFL)Design (DFL)Flood Level (DFL)Swing DFSensitivity %Swing DF %Sensitivity %2.3294.82.1994.80.02881.20.02721.2	Full (FSL)Supply LevelLevel Design (DFL)Flood Flood Flood (DFL)Level (OL)Overtopping (OL)Swing DFSensitivity %Swing DF %Sensitivity %Swing DF2.3294.82.1994.82.070.02881.20.02721.20.0257	(FSL)(DFL)(OL)Swing DFSensitivity $%$ Swing DF $%$ Sensitivity $%$ Swing DFSensitivity $%$ 2.3294.82.1994.82.0794.80.02881.20.02721.20.02571.2

 Table 5: Sliding Unconditional Probability of Failure: FORM -TS and Monte Carlo Simulation

Load Cases	Water Level AEP Event	Taylor Series Conditional P <sub>f</sub>	Taylor Series Unconditional, P <sub>f</sub>	Monte Carlo Simulation Conditional P <sub>f</sub>	Monte Carlo Simulation Unconditional , P <sub>f</sub>
Full Supply Level (FSL) Usual	1	7.981E-02	7.981E-02	4.863E-02	4.863E-02
Design Flood Level (DFL) Unusual	10-3	9.965E-02	9.965E-05	6.152E-02	6.152E-05
Overtopping (OL) Extreme	10-4	1.205E-01	1.205E-05	7.477E-02	7.477E-06

1169



## 7 Conclusions

- 1. The results indicate that FORM is conservative for the probabilistic risk-based analysis as a reference for the buttress concrete dam design for the sliding failure mode. At no likelihood of overturning failure, FORM and MCS have the same probability value. MCS is thus recommended to be used as the design reference for the concrete buttress dam.
- 2. Sliding is the most dominant failure mode for the buttress concrete dam. The overturning mode has no probability of occurrence, with the most probable reason being that the concrete density and coefficient of hydraulic inefficiency presented balanced contributions.
- 3. A strong linear correlation with  $R^2 > 0.996$  between the sliding probability of failure  $P_f$  and the sliding factor of safety has been established.
- The FORM-Taylor Series- Monte Carlo analysis for sliding has an excellent linear correlation with R<sup>2</sup>= 1. FORM is 62.0% more conservative than the Monte Carlo analysis for the sliding mode of failure.
- 5. The conditional and unconditional sliding probability of failure for the full supply level (FSL) case is higher than 1.0 x  $10^{-4}$  as per ICOLD (2005) requirement. Unconditional sliding probability of failure for design flood and overtopping level load cases are lower than  $1.0 \times 10^{-4}$ .
- 6. No likelihood of unconditional or conditional overturning probability of failure for all load case (FSL, DFL, and OL) events.
- 7. The major sensitivity of 94.8% for sliding failure is the friction angle, whereas the Density and cohesion have a very low sensitivity of 4.0% and 1.2%, respectively.

## Acknowledgments

The authors would like to thank INTI International University, Malaysia for the financial support for the publication of this article.

## References

- [1] Barpi, F. and Valente, S. (2008), Modeling water penetration at dam-foundation joint. *Eng. Fract. Mech.* 2008, 75, 629–642.
- [2] Brian, F. (2008), RCC-New developments and innovations, *Proceedings of the Brazilian International Roller Compacted Concrete (RCC) Symposium*, pp. 1–18, Salvador, Brazil, 2008.
- [3] Carvajal, C., Peyras, L., Bacconnet, C. and Bécue, J-P (2011), Probability modelling of shear strength parameters of RCC gravity dams for reliability analysis of structural safety. *European Journal of Environmental and Civil Engineering*, Taylor &

Francis, 2011, 13 (1), pp.91-119.

- [4] CEB-FIP Model Code 1990 (1991), Comite Euro-International du Beton. Bulletin d'information, No. 213/214, Lausanne. Cederström, M. (2009) Personal communication.
- [5] CEN 2001, European Committee for Standardisation -CEN, "Basis of structural design. EN 1990." Brussels, Belgium, 2001.
- [6] China Electric Council (2010), Electric Power Industry Standard of the People's Republic of China (DLT 698.31-2010), 2010.
- [7] Chen, Y. and Lin, P. (2018), The Total Risk Analysis of Large Dams under Flood Hazards, Water 2018, 10, 140; doi:10.3390/w10020140.
- [8] Christian, J. T., Ladd, C. C., and Baecher, G. B. (1994), Reliability applied to slope stability analysis, *J. Geotech. Engr.*, 20, Dec., 2180–2207.
- [9] Das, S. and Tesfamariam, S. (2023), Reliability analysis of structures using probability density evolution method and stochastic spectral embedding surrogate model, Earthquake Engineering Structure Dynamics, 2023;52:2480–2497. DOI:10.1002/eqe.3835.
- [10] Duncan, J. M. (2000). Factors of Safety and Reliability in Geotechnical Engineering, *Journal of Geotechnical* and Geo-environmental Engineering, 127(8):700-721 doi: 10.1061/(ASCE)1090-0241(2001)127:8(700).
- [11] Fluixá-Sanmartín, J., Altarejos-García, L., Morales-Torres, A. and Escuder-Bueno, I. (2018), Review article: Climate change impacts on dam safety, *Nat. Hazards Earth Syst. Sci.*, 18, 2471–2488, 2018.
- [12] Garcia, L.A, Bueno, I.E, Lombillo, A.S. and Ortuno M.G.M, (2012) Methodology for estimating the probability of failure by sliding in concrete gravity dams in the context of risk analysis, *Structural Safety*, *36, 1-13, 2012.*
- [13] Hariri-Ardebili, M. A., Risk, Reliability, Resilience (R3) and beyond in dam engineering: A state-of-the-art review, *International Journal of Disaster Risk Reduction* 31 (2018) 806–831.
- [14] Hu, W., Zhong, D., Wu, B., & Li, Z. (2019). Construction phase oriented dynamic simulation: taking RCC dam placement process as an example. *Journal of Civil Engineering and Management*, 25(7), 654-672.
- [15] ICOLD (1993), International Commission on Large Dams, *Bulletin 88: Rock foundations for dams* ICOLD, Paris, 1993.
- [16] ICOLD (2005), International Commission on Large Dams, Bulletin 130: Risk assessment in dam safety

management, Paris 2005.

- [17] Khan, M.D.H., Nur, S. M., El-Shafie, A. (2018), A Review of Fundamental Drought Concepts, Impacts and Analyses of Indices In Asian Continent, Journal of Urban and Environmental Engineering, 12,1,106-119, 2018. doi: 10.4090/juee.2018.v12n1.106119.
- [18] Kunkel, K.E., Karl, T.R., Easterling, D.R., Redmond, K., Young, J., Yin, X. and Hennon, P. (2013), Probable maximum precipitation and climate change, Geophysical Research Letters, VOL. 40, 1402–1408, doi:10.1002/grl.50334, 2013.
- [19] Loza, A.R.A and Fidélis, T. (2021), Literature review on the analysis of climate change risks in the environmental impact assessment of dams, *Impact* Assessment and Project Appraisal, 39:4, 277-289, DOI: 10.1080/14615517.2021.1893928.
- [20] Lu, Y., Pang, R., Du, M., Xu, B. (2024) Simulation of non-stationary ground motions and its applications in high concrete faced rockfill dams via direct probability integral method, *Engineering Structures*, 2024, 298: 117034.
- [21] Muench, S. (2010). Probabilistic User's Guide. Seattle: University of Washington.
- [22] Pang, R., Zhou, Y., Chen, G., Jing, M. and Yang, D. (2023), Stochastic Mainshock–Aftershock Simulation and Its Applications in Dynamic Reliability of Structural Systems via DPIM, J. Eng. Mech., 2023, 149(1): 04022096.
- [23] Pei, L.; Chen, C.; He, K.; Lu, X. (2022) System Reliability of a Gravity Dam-Foundation System Using Bayesian Networks. *Reliab. Eng. Syst. Saf.* 2022, 218, 108178.
- [24] Pires, K.O, Beck, A.T., Bittencourt, T.N and Futai, M.M (2019) Reliability analysis of built concrete dam, *Ibracon Structures and Materials Journal*, Vol 12, Number 3 (June 2019) p 551-579. ISSN 1983-4195.
- [25] Phoon, K.K (2019) Reliability-Based Design in Geotechnical Engineering Computations and Applications, Published December 12, 2019 by CRC Press, 544 Pages ISBN 9780367864132
- [26] Reclamation (2003), United States Department of the Interior, Bureau of Reclamation, "Guidelines for Achieving Public Protection in Dam Safety Decision Making," 15 June 2003.
- [27] Salas, J.D, Anderson, M.L., Papalexiou, S.M. and Frances, F. (2020), State-of-the-Art Review: PMP and Climate Variability and Change: A Review, J. Hydrol. Eng., 2020, 25(12): 03120002, DOI: 10.1061/(ASCE) HE.1943-5584.0002003.
- [28] Scott, G.A., J.T. Kottenstette, and J.F. Steighner. 2001.
   "Design and Analysis of Foundation Modifications for a Buttress Dam." *Proceedings*, 38th U.S. Symposium

on Rock Mechanics, Washington, D.C. pp. 951-957.

- [29] Sharafati, A.; Yaseen, Z.M.; Pezeshki, E. (2020) Strategic Assessment of Dam Overtopping Reliability Using a Stochastic Process Approach. J. Hydrol. Eng. 2020, 25, 04020029.
- [30] Sibuea, P.R.A., Agriamah, D.R., Riawan, E., Suwarman, R. and Lubis, A. (2021) Estimation of Probable Maximum Precipitation (PMP) and Probable Maximum Flood (PMF) Using GSSHA Model (Case Study Area Upper Citarum Watershed), IOP Conf. Ser.: Earth Environ. Sci. 893 012023DOI 10.1088/1755-1315/893/1/012023.
- [31] Spross, J., Johansson, F. and Larsson, S. (2014), On the use of pore pressure measurements in safety reassessments of concrete dams founded on rock. *Georisk: Assess. Manag. Risk Eng. Syst. Geohazards* 2014, 8, 117–128.
- [32] Tang, W. H., Stark, T. D., and Angulo, M. (1999), Reliability in back analysis of slope failures, *J. Soil Mech. and Found.*, Tokyo, October 1999.
- [33] USACE (1997). 'Engineering and design introduction to probability and reliability methods for use in geotechnical engineering. Engr. Tech. Letter No. 1110-2-547, Department of the Army, Washington, D.C., 30 Sept. 1997.
- [34] USACE (1998), *Risk-based analysis in geotechnical engineering for support of planning studies*, Engrg. Circular No. 1110-2-554, Department of the Army, Washington, D.C., 27 Feb. 1998.
- [35] USACE (2000), *Planning Guidance Notebook*. United States Army Corps of Engineers, ER 1105-2-100, 2000.
- [36] USACE (2014) Safety of Dams Policy and Procedures, US Army Corps of Engineers, ER1110-2-1156, 31 March 2014
- [37] Wolff, T. F. (1994), Evaluating the Reliability of existing levees, Rep., Res. Project.: Reliability of existing levees, prepared for U.S. Army Engineer Waterways Experiment Station Geotechnical Laboratory, Vicksburg, Miss., USA.
- [38] Nagayama, I., & Jikan, S. (2003). 30 Years' History of Roller-compacted Concrete Dams in Japan. Fourth Int. Symp. on Roller Compacted Concrete Dams,2003
- [39] Xin, C. and Chongshi, G. (2016), Risk analysis of gravity dam instability using credibility theory Monte Carlo simulation model. *SpringerPlus* 5, 778 (2016). <u>https://doi.org/10.1186/s40064-016-2508-7</u>.
- [40] Xu, M., Pang, R., Zhou, Y., Xu, B. (2023) Seepage safety evaluation of high earth-rockfill dams considering spatial variability of hydraulic parameters via subset simulation, *Journal of Hydrology*, 626 (2023) 130261.





[41] Yang, Z.; Ching, J. A (2020), Novel Reliability-Based Design Method Based on Quantile-Based First-Order Second-Moment. Appl. Math. Modell. 2020, 88, 461-473.

## **Biography:**



Zakaria Che Muda earned his Ph. D. degree in Built Environment from University of Malaya. He is currently a Professor at the Department of Civil Engineering, INTI International University. He has published over 100 papers in international journals. His research interests are focused on approximate analytical methods,

numerical analysis, reliability-based analysis, fibrereinforced concrete and energy-efficient buildings.



Mohamed Ahmed Hafez earned his Ph. D. degree in Civil Engineering from University of Malaya. He is currently an Associate Professor at the Department of Civil Engineering, INTI International University. He has published over 55 papers in international journals. His research interests are focused on Dam risk assessment, slope stability and soft

ground improvement.



Lariyah Mohd Sidek earned his Ph. D. degree in Civil Engineering (Urban Drainage) from Kyoto University, Japan in 2005. Currently she is a Professor and Head of Centre for Technology Sustainable and Environmental at University Tenaga Nasional. She has published about

350 papers in international conferences and journals. Her research interests include Water Resources Engineering, Dam Break Study, Risk Informed Decision Making on Dam Safety.



Hidayah Basri is earned her Ph. D degree in Civil Engineering from University Tenaga Nasional, Malaysia in 2022. She is currently a Senior Lecturer at the Institute of Energy Infrastructure, and Civil Engineering Department at University Tenaga Nasional. She has published about 175

papers in conference proceedings and journals. Her research interest includes hydrological forecasting, dam safety and emergency response plan. She is the Member of Young Professional Forum of International Commission of Large Dams (ICOLD).



Salmia Beddu earned her Ph. D. degree in Civil Engineering from University of Petronas, Malaysia in 2012. Currently she is a Senior Lecturer at University Tenaga Nasional. She has published about 166 papers in conference proceedings and journals. Her research interests include Green Concrete, Composite

Materials and Environmental Engineering.



Siti Mariam Allias Omar is a Research Engineer currently employed at ZHL Engineers Sdn. Bhd. With a keen interest in advancing her expertise, she is concurrently pursuing her Master's studies in the esteemed Civil Engineering Department at University Tenaga Nasional. She has

published several papers in international journals. Her research interest is in the risk assessment of the dam.



Zaher Almakahal is currently a graduate research assistance and master student at the Department of Civil Engineering, INTI International University. He has published several papers in international journals. His research interests are focused on approximate

analytical methods, numerical analysis, reliability-based analysis.



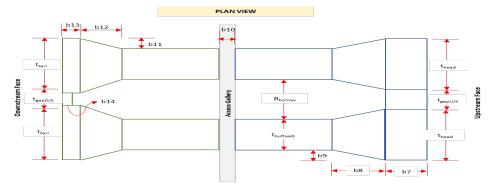
As'ad Zakaria is currently a Ph. D student at the Institute of Energy Systems, School of Engineering, University of Edinburgh, Edinburgh, UK. He has published over 10 papers in the Q1 and Q2 journals. His research interest is in Stochastic Optimization, Monte Carlo Simulation, power system analysis

and renewable energy system.



## Appendix 1: Reliability Risk Analysis Form - Taylor Series Approximation of a Concrete Buttress Dam Basic Data:

GENERAL	UNIT	
Date of construction	1960	
Dam Crest Level	32.00	m asl
Full Supply Level (FSL) - AEP 1:1	31.00	m asl
Overtopping level (PMF Level) - AEP 1:10,000)	33.00	m asl
Design Flood level (DFL) - AEP 1:1,000	32.00	m asl
Minimum operating level	22.50	m asl
Sedimentation Level = 1/3 of FSL	10.33	m asl



RANDOM VARIABLE	UNIT	Mean, µ	Std. Dev, σ
Friction angle, Ø	Degree	50	13.26
Internal friction angle, tan $\phi$	-	1.19	0.24
Cohesion coeff., C'	kN/m <sup>2</sup>	1.2	0.44
Unit weight of concrete, y <sub>conc</sub>	kN/m³	24.5	0.735
DETERMINISTIC	UNIT	Mean	
Unit weight of water, y <sub>w</sub>	kN/m <sup>3</sup>	10.0	
Unit weight of silt, γ <sub>silt</sub>	kN/m <sup>3</sup>	9.0	



	Calculation of Forces									
1. Self-Weig	1. Self-Weight of the dam									
Section No.	Particulars	5	Vertical Force (kN)	Lever ar	m (m)	Moment (kNm)				
w1	b6*h3*	B*γ <sub>conc</sub> =	4283.21	b2 + b6/2 =	22.33	95648.42				
w2	1/2*b5*h4*	B*γ <sub>conc</sub> =	1713.29	b2-(1/3*b5) =	18.45	31603.26				
U/S	1/2*(b6+b1)*(h1+h2)*B* $\gamma_{conc} =$ 1/2*(b5+b2)*(h1+h2)*B* $\gamma_{conc} =$		45161.16							
D/S			56645.53	L/2 =	17.50	1781617.03				
Hollow Buttress Web	1/2*(b3 + b4) * h1* B <sub>hollow</sub> * γ <sub>conc</sub> =		-44905.44	b12+b13+ (b3/2) =	16.07	-721675.29				
Hollow Buttress Head and Tail	[(0.5*(t <sub>gapD/S</sub> +B <sub>hollow</sub> )*b12 *h7) +(0.5*(t <sub>gapU/S</sub> +B <sub>hollow</sub> ) *b8*h8)]* γ <sub>conc</sub> =		-12257.19	L/2 =	17.50	-214500.82				
		Total	50640.56			972692.60				

## 2. Hydrostatic Load U/S

b) Reservoir at Design Flood Level (DFL)

Height of water,  $h_{WUPS} = 32.00$ 

m

Section No.	Particulars	Force ( <u>kN</u> )	Lever arm (m)		Moment ( <u>kNm</u> )
Horizontal	1/2*h <sub>wups</sub> <sup>2</sup> *B* <u>y</u> =	38400.00	hwups /3 =	10.67	409600.00
Vertical	1/2 *b1* hwwps *B*yw =	18000.00	b2+b6+(2/3* (b1-b6)) =	31.55	567972.00

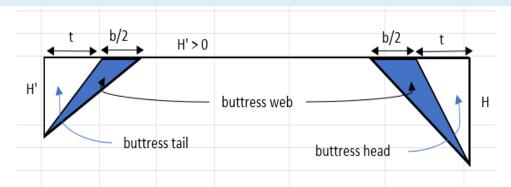
## 3. Hydrostatic Load D/S

b) Reservoi	ir at Design Flood Le	vel (DFL)				
	Heig	Height of Tail Water, h <sub>TWLs</sub> =			m	
Section No.	Particulars	Particulars Force (kN) Lever arm (m		n (m)	Moment (kNm)	
Horizontal	1/2*h <sub>TWL</sub>	<sup>2</sup> *Β* γ <sub>w</sub> =	459.38	h <sub>TWL</sub> /3 =	1.17	535.94



4. Silt Load						
		Dept	h of Silt <sub>,</sub> h <sub>silt</sub> =	10.33	m	A third of FS
	Sediment, φ' =			25	0	
	Coefficient	Coefficient of active pressure, Ka =				
Section No.	Particulars	Particulars		Lever ar	m (m)	Moment (kNm)
Horizonta	1/2*h <sub>silt</sub> <sup>2</sup> *B*	γ <sub>silt</sub> <sup>∗</sup> Ka=	1462.61	h <sub>silt</sub> /3 =	3.44	5037.89
Vertical	1/2*h <sub>silt</sub> *(b1-b6	5)*B* γ <sub>silt</sub> *Ka=	1463.27	b2+b6+(2/3* (b1-b6))=	31.55	46172.12

5. Uplift Pressure



	b) Reservo	oir at Design Flood Level (DFL)				
		Height	of water, H =	32	m	
		Height	of water, H' =	3.50	m	
	Section No.	Particulars	Uplift Vertical Force (kN)	Lever arm (m)		Moment (kNm)
U/S	Buttress Head	$\begin{array}{l} 1/2^{*}Y_{w}^{*} \ H^{*} \ [[0.5^{*}(t_{head}^{-}\\t_{buttweb})^{*}b8] + [(t_{head}^{-}\\t_{buttweb})^{*}b7] + (t_{gapU/S} \ ^{*}b7)] = \end{array}$	2924.64	L- 1/3*(b7+b8)=	33.07	96712.00
0/3	Buttress Head + b/2*web	1/2*y <sub>w</sub> * H* [t <sub>buttweb</sub> * (b7+b8+(t <sub>buttweb</sub> /2))] =	2174.72	L-1/3*(b7+b8 + t <sub>buttweb</sub> /2)=	32.73	71188.73
D/S	Buttress Tail	$\begin{split} 1/2*\gamma_w * \ H' * \ [[0.5*(t_{tail} - t_{buttweb})*b12] + [(t_{tail} - t_{buttweb})*b13] + (t_{gapD/S} * b14)] = \end{split}$	138.11	1/3 *(b12+b13)=	0.98	135.62
	Buttress Tail + b/2*web	1/2*y <sub>w</sub> * H'* [t <sub>buttweb</sub> * (b12+b13+(t <sub>buttweb</sub> /2))] =	138.11	1/3 * [b12+b13 + (t <sub>buttweb</sub> /2)]=	1.32	181.66
		Total	5375.58			168218.01

6.0 Load Combinations



c) Reservo	oir at Design Flood Level (DFL)				
No.	Particulars	Horizontal Force (kN)	Overturn Moment (kNm)	Vertical Force (kN)	Resist Moment (kNm)
1	Self-Weight of the Concrete			50640.56	972692.60
2	Horizontal Hydrostatic Pressure U/S	38400.00	409600.00		
3	Vertical Hydrostatic Pressure U/S			18000.00	567972.00
4	Horizontal Silt Pressure	1462.61	5037.89		
5	Vertical Silt Pressure			1463.27	46172.12
6	Horizontal Hydrostatic pressure D/S	-459.38	-535.94		
7	Vertical Hydrostatic pressure D/S			4932.13	
8	Uplift Pressure		168218.01	-5375.58	
	Total	39403.24	582319.96	69660.38	1540664.60

## 6.0 Factor of Safety (FMLV)

Sliding F <sub>N</sub>	$ALV = \{C_u A$	$+(\Sigma W_{conc} -$	+ $\sum W_{water}$ + $F_h$ + $F_{silt}$ -	$\Sigma W_{silt} - \Sigma U_{upli_j}$ $F_{tail}$	ft)tanØ}		
Overturni	$ng F_{MLV} =$	$\{\sum W_{conc}\}$		1 1	$w_{ater} + \sum W_{silt}$ . $\frac{W_{silt}}{3} + \sum U_{uplift}$		<u>ail}</u>
	Load Combination						F <sub>MLV</sub> Overturning
Full Su	oply Level (	(FSL)				2.24	2.82
Overto	Overtopping Level (OL)						2.48
Design	Design Flood Level (DFL)						2.65

### SUMMARY RESULTS

Case	U/S Head, h <sub>w</sub> (m)	D/S Head, h <sub>tail</sub> (m)	Sliding F <sub>MLV</sub>	Reliability Index, β <sub>LN</sub>	Failure Probability, P <sub>f</sub>	Overturn F <sub>MLV</sub>	Reliability Index, β <sub>LN</sub>	Failure Probability, P <sub>f</sub>
Full Supply Level	31.00	3.50	2.24	1.406	7.981E-02	2.82	54.150	0.000E+00
Design Flood Level	32.00	3.50	2.11	1.284	9.965E-02	2.65	51.364	0.000E+00
Overtopping Level	33.00	3.50	2.00	1.173	1.205E-01	2.48	48.604	0.000E+00



7.0 FORM – Taylor Series Reliability Analysis									
Sliding at DFL									
Variables	Va	Factor of	Factor of Safety						
Concrete unit weight, γ <sub>c</sub>									
Most Likely Value (MLV) + $\sigma$	25.235	kN/m <sup>3</sup>	F+	2.15E+00	9.19E-02				
Most Likely Value (MLV) - $\sigma$	23.765	kN/m <sup>3</sup>	F-	2.06E+00	9.19E-02				
		Friction Angle	e, Ø						
Most Likely Value (MLV) + $\sigma$	63.26	0	F+	3.51E+00	2.19E+00				
Most Likely Value (MLV) - $\sigma$	36.74	0	F-	1.32E+00	2.191+00				
		Cohesion,	С						
Most Likely Value (MLV) + $\sigma$	1.64	0	F+	5.15E-02	2.72E-02				
Most Likely Value (MLV) - $\sigma$	0.76	•	F-	2.44E-02	2.722-02				
	F	<sub>MLV</sub> Sliding	=	2.	11				
$\sigma_F = \sqrt{\left(\frac{\Delta F_1}{2}\right)^2 + \left(\frac{\Delta F_2}{2}\right)^2}$	=	1.096							
$V_F = \frac{\sigma_F}{F_{MLV}} $	=	0.519							
$\beta_{LN} = \frac{ln(F_{MLV}/\sqrt{1+V^2})}{\sqrt{\ln(1+V^2)}}$	=	1.284							
Prob	=	0.900							
Prob	Probability of Failure, P(f)				5E-02				

Overturning at DFL								
Variables	Factor of	ΔF						
Concrete unit weight, $\gamma_c$								
Most Likely Value (MLV) + $\sigma$	25.235	kN/m <sup>3</sup>	F+	2.78E+00	1 005 01			
Most Likely Value (MLV) - $\sigma$	23.765	kN/m <sup>3</sup>	F-	2.67E+00	1.00E-01			
	F <sub>MLV</sub> Ov	verturning	=	2.	65			
$\sigma_F = \sqrt{\left(\frac{\Delta F_1}{2}\right)^2}$	itandard D	=	0.050					
$V_F = \frac{\sigma_F}{F_{MLV}} $	=	0.019						
$\beta_{LN} = \frac{\ln(F_{MLV}/\sqrt{1+V^2})}{\sqrt{\ln(1+V^2)}}$	=	51.364						
Prob	=	1.000						
Prob	=	0.00	E+00					



## **Appendix 2: Reliability Risk Analysis - Monte Carlo Simulation**

### Output File

## Title: Hollow Buttress Section - Sliding Probability of Failure at Design Flood Level (DFL)

x10<sup>6</sup> DFL Sliding Pf Volume of Concrete in m<sup>3</sup> is 2.0670e+03 Volume of Water in m<sup>3</sup> is 2.2932e+03 5.0 FOS=1.0 Weight of Water in kN is 2.2496e+04 Non-Failure Samples = 9,384,765 Submerged Density of silt in kg/m<sup>3</sup> is 10 4.0 Sample Population Volume of Silt in m<sup>3</sup> is 162.5900 Failure Samples = 615,235 Weight of Silt in kN is 1.6259e+03 3.0 Total Uplift Force in kN is 5.3756e+03 Total Horizontal Hydraulic Force upstream in kN is 38400 2.0 Total Horizontal Silt Force upstream in kN is 1.4626e+03 Total Horizontal Tail Hydraulic Force downstream in kN is 1.0 459.3800 Area of Contact m2 is 96.1500 Total Number of Monte Carlo Sample is 10000000 0 5 10 15 20 Total Number of Failures out of Total Samples are 615235 Sliding FOS Probability of Failure is 6.15235e-02 Reliability Index (Beta) is 1.542

## Title: Hollow Buttress Section - Overturning Probability of Failure at Design Flood Level (DFL)

Volume of Concrete in m<sup>3</sup> is 2.0670e+03 x10⁵ DFL Overturning Pf Lever arm, X Concrete in m is 19.2100 2.5 Volume of Water in m<sup>3</sup> is 1800 Weight of Water in kN is 17658 Non-Failure Samples = 10.000.000 Lever arm, X Water in m is 31.5500 2.0 Sample Population Submerged Density of silt in kg/m<sup>3</sup> is 9.0 Volume of Silt in m<sup>3</sup> is 162.5900 1.5 FOS=1.0 Weight of Silt in kN is 1.4633e+03 Lever arm, X silt in m is 31.5500 Total Horizontal Hydrostatic Force upstream in kN is 1.0 5.9214e+04 Lever arm, Y Water upstream in m is 10.6700 Total Horizontal Silt Force upstream in kN is 1.4626e+03 0.5 Lever arm, Y silt in m is 3.4400 Total Uplift Moment in kNm is 1.6822e+05 0 Total Horizontal Hydrostatic Force downstream in kN is 1.0 1.1 1.2 1.3 1.4 1.5 1.6 1.7 1.8 1.9 2.0 59.3800 Lever arm. Y Water downstream in m is 1.1700 Overturning FOS Area of Contact m2 is 96.1500 Total Number of Monte Carlo Sample is 10000000 Total Number of Failures out of Total Samples are 0 Probability of Failure is 0 Reliability Index (Beta) > 8.0

