

# New Dam Break Risk Assessment Method in Fuzzy Framework

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HS7.5 - Hydro-meteorological  
extremes and hazards:  
vulnerability, risk, impacts and  
mitigation



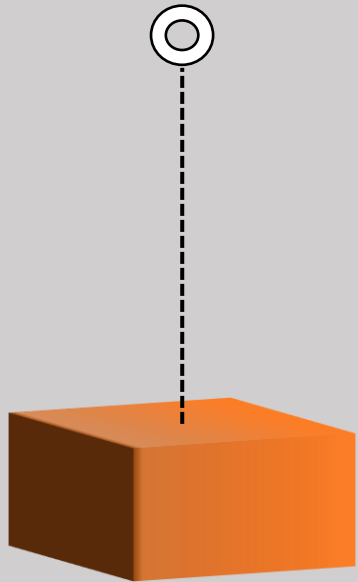
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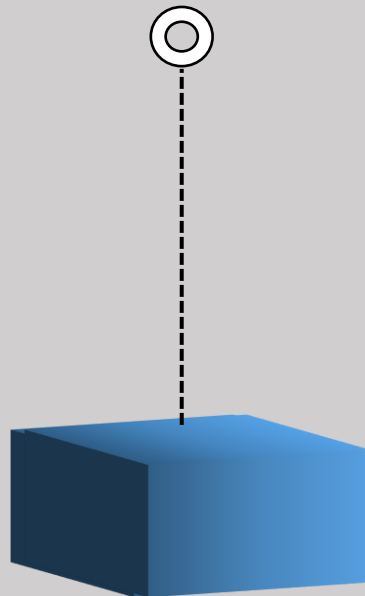
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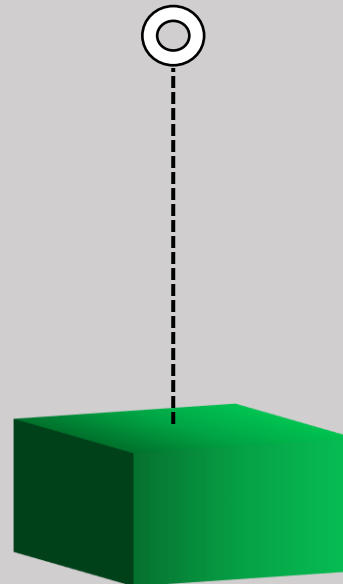
Dams are useful for mitigation of floods, and at the same time there is risk of dam failure due to floods, seismic hazards and factors such as ageing of dam material.



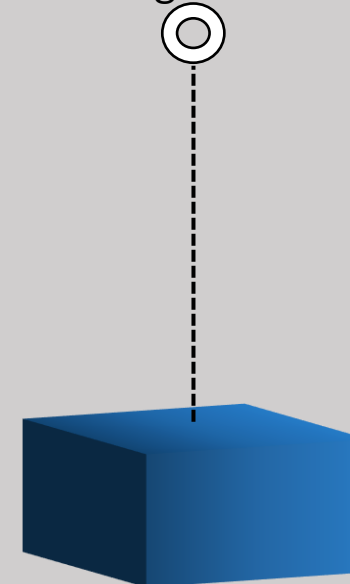
There is need to perform risk assessment of dams as their failure can have catastrophic consequences on establishments located in their downstream locations.



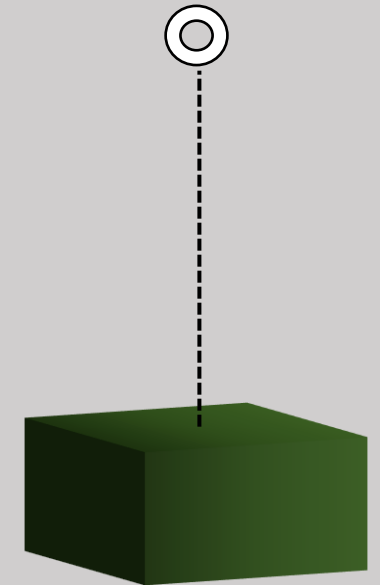
Effective risk analysis requires accounting for both failure probability of dam and dam break consequences.



There are numerous factors which effect the consequences, and due to lack of data and knowledge there is considerable amount of uncertainty, vagueness and ambiguity among them.



Fuzzy hierarchical model for risk assessment based on combination of static and variable fuzzy set theory is proposed in the study.



## Risk Indexes classification in fuzzy framework

$$\text{Risk} = \text{Likelihood} \times \text{Consequences}$$

The model synthetically evaluates the dam break consequences based on exposure and Hazard Severity. Hence, the dam break risk can be assessed based on three evaluation indices i.e., *likelihood of dam break flood*, *hazard severity ( $S_D$ )* and *degree of exposure*.

$$R_i = f(\ell, S_D, e_i)$$

Where.

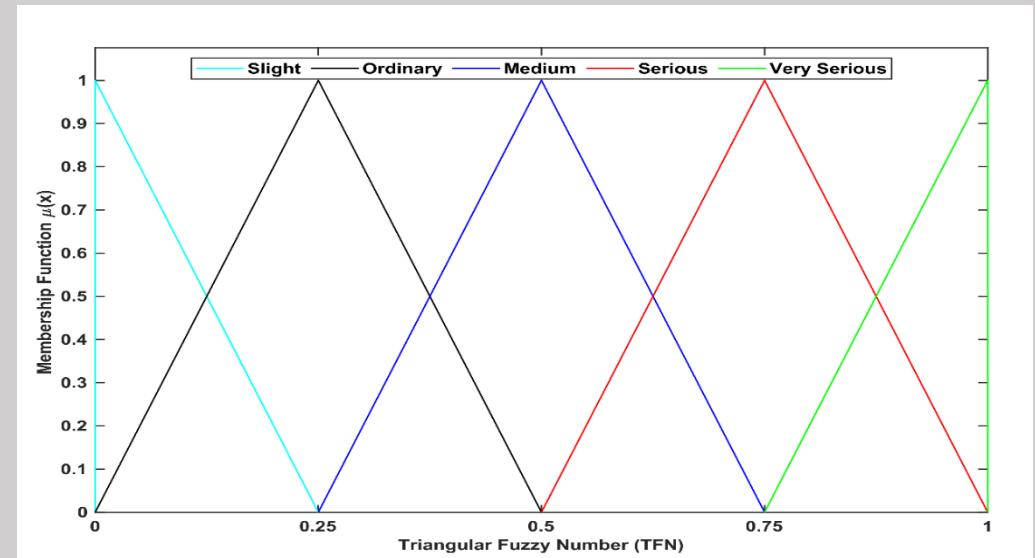
$\ell$  is the likelihood of occurrence of dam break flood,

$S_D$  is the Hazard severity

$e_i$  is the degree of exposure for  $i^{th}$  influencing factor of dam break consequences.

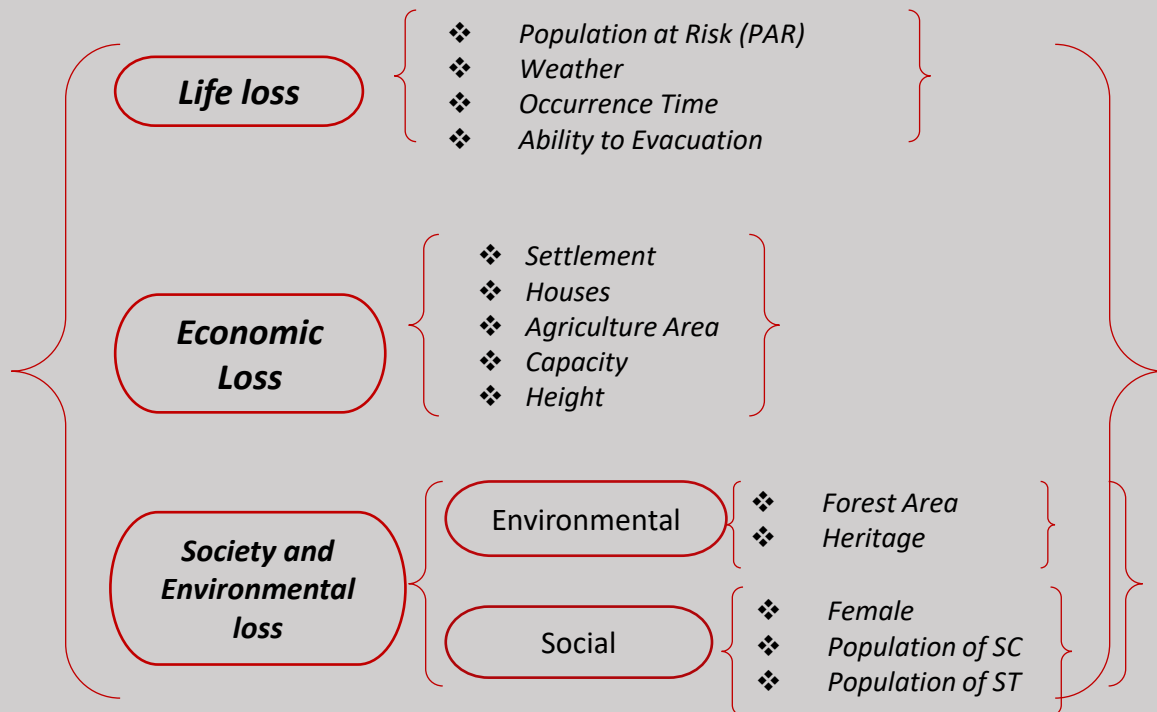
Evaluation Level	Likelihood	Hazard Severity ( $S_D$ )	TFN
Extremely Low	$> \frac{1}{10}$	$< 0.3$	$< 0, 0, 0.25 >$
Low	$\frac{1}{10} - \frac{1}{100}$	$0.3 - 0.6$	$< 0, 0.25, 0.50 >$
Moderate	$\frac{1}{100} - \frac{1}{1000}$	$0.6 - 1.0$	$< 0.25, 0.50, 0.75 >$
Severe	$\frac{1}{1000} - \frac{1}{10000}$	$1.0 - 4.0$	$< 0.50, 0.75, 1 >$
Extremely Severe	$< \frac{1}{10000}$	$> 4.0$	$< 0.75, 1, 1 >$

Linguistic classification of grades of likelihood of flood and hazard severity and their corresponding TFNs



✓ To establish a hierarchical structure of influencing factors of dam break consequences, the exposure evaluation index is classified into 3 risk categories i.e., *life loss*, *economic loss* and *social and environmental influence*, which are main contents of dam break consequence assessment.

✓ Furthermore, each risk category is sub-divided into influencing factors of consequences called exposure indices or risk items



*Hierarchal Structure of influencing factors of Dam break consequences.*

## Dam break consequences

Quantitative Data					
Evaluation Level	Slight	Ordinary	Medium	Serious	Extremely Serious
Population at Risk (PAR)	< 500	501 - 1000	1001 – 2000	2001 - 3000	>3000
Households	< 100	101 - 200	201 - 300	301 - 450	> 450
Female Population	< 250	251 - 500	501 - 750	751 - 1000	> 1000
Schedule Caste Population	< 50	51 - 100	101 -200	201 - 300	>300
Schedule Tribe Population	< 50	51 - 100	101 -200	201 - 300	>300
Capacity (Mm <sup>3</sup> )	< 1	1 - 10	10 - 100	100 - 1000	> 1000
Height (m)	< 10	10 - 20	20 - 30	30 - 60	> 60
Forests Area (Ha)	< 50	50 - 100	100 - 150	150 - 200	> 200
Agricultural Area (Ha)	< 100	100 -200	200 - 350	350 - 500	> 500
Qualitative Data					
Settlement	Few Households	Village	Town	City	Capital City
Heritage	General	Municipality	State	National	World
Weather	Sunny Day	Sprinkle	Moderate Rain	Rainstorm	Heavy Storm
Occurrence Time	Daytime	Working Day in Night	Holidays at Night	Working Days in Morning	Holidays in Morning
Ability to Evacuation	Extremely Sound	Sound	General	Unsound	Terrible Unsound

*Classification and grade suggestion for indexes of exposure*



- Construction of Fuzzy Pairwise Comparison matrix using Saaty scale of comparison: Let W be the pairwise comparison matrix then,

$$W = [w_{ij}]_{n \times n} = \left[ \frac{w_i}{w_j} \right]_{n \times n} = \begin{bmatrix} w_{11} & w_{12} & w_{13} & \cdots & w_{1n} \\ w_{21} & w_{22} & w_{23} & \cdots & w_{2n} \\ w_{31} & w_{32} & w_{33} & \cdots & w_{3n} \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ w_{n1} & w_{n2} & w_{n3} & \cdots & w_{nn} \end{bmatrix}$$

- Estimation of local weights of criterion using Eigen vector method: if W is known and w is unknown then w can be recovered using eigen vector method

$$W \times w = \begin{bmatrix} 1 & \frac{w_1}{w_2} & \frac{w_1}{w_3} & \cdots & \frac{w_1}{w_n} \\ \frac{w_2}{w_1} & 1 & \frac{w_2}{w_3} & \cdots & \frac{w_2}{w_n} \\ \frac{w_3}{w_1} & \frac{w_3}{w_2} & 1 & \cdots & \frac{w_3}{w_n} \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ \frac{w_n}{w_1} & \frac{w_n}{w_2} & \frac{w_n}{w_3} & \cdots & 1 \end{bmatrix} \begin{bmatrix} w_1 \\ w_2 \\ \vdots \\ w_n \end{bmatrix} = \begin{bmatrix} \lambda w_1 \\ \lambda w_2 \\ \vdots \\ \lambda w_n \end{bmatrix} = \lambda \times w$$

*Vector of weights*  
 $w = [w_1, w_2, w_3 \dots \dots w_n]^T$

- Consistency Check: After obtaining  $\lambda_{max}$ , first Consistency Index (CI) and then consistency Ratio (CR) is determined as follows. If C.R. < 0.1 the inconsistencies are tolerable and reliable results are expected from F-AHP.

$$C.I. = \frac{\lambda_{max} - n}{n - 1} \quad C.R. = \frac{C.I.}{R.I.n} \quad n = \text{number of criteria}$$

- Defuzzification: Since the calculation so far involves fuzzy variables, the next step is to defuzzify the fuzzy weights to form meaningful local weights for analysis

$$M_i = \frac{[Lw_i + Mw_i + Uw_i]}{3}$$

Risk Category	Intermediate Layer	Sub-Criterion / Index Layer	Weight
(W <sub>i</sub> )		(W <sub>ij</sub> )	(W <sub>n</sub> = W <sub>i</sub> × W <sub>ij</sub> )
Life 0.7338		PAR 0.5147	<b>0.42</b>
		Weather 0.1495)	<b>0.1097</b>
		Occurrence time 0.0532	<b>0.0390)</b>
		Ability to evacuation 0.2826	<b>0.2074</b>
Economy 0.0995		Settlement 0.3812	<b>0.0379</b>
		Houses 0.1229	<b>0.0122</b>
		Agriculture area 0.0508	<b>0.0050</b>
		Capacity 0.2225	<b>0.0221</b>
		Height 0.2225	<b>0.0221</b>
Environmental and Social 0.1667	Environmental (0.5)	Forest area 0.7424	<b>0.0618</b>
		Heritage 0.2576	<b>0.0214</b>
	Social (0.5)	Female 0.15	<b>0.0125</b>
		Population of SC 0.42	<b>0.0350</b>
		Population of ST 0.42)	<b>0.0350</b>





## Step 1: Interval Matrix

$$I_{ab} = \begin{bmatrix} [a_{11}b_{11}] & [a_{12}b_{12}] & [a_{13}b_{13}] & \cdots & [a_{1c}b_{1c}] \\ [a_{21}b_{21}] & [a_{22}b_{22}] & [a_{23}b_{23}] & \cdots & [a_{2c}b_{2c}] \\ [a_{31}b_{31}] & [a_{32}b_{32}] & [a_{33}b_{33}] & \cdots & [a_{3c}b_{3c}] \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ [a_{m1}b_{m1}] & [a_{m2}b_{m2}] & [a_{m3}b_{m3}] & \cdots & [a_{mc}b_{mc}] \end{bmatrix} = [a_{ij}b_{ij}]_{m \times c}$$

## Step 2: Bound Matrix

Next step is to construct the indicator variable interval matrix  $I_{cd}$  also called extended interval matrix.

$$I_{cd} = \begin{bmatrix} [c_{11}d_{11}] & [c_{12}d_{12}] & [c_{13}d_{13}] & \cdots & [c_{1c}d_{1c}] \\ [c_{21}d_{21}] & [c_{22}d_{22}] & [c_{23}d_{23}] & \cdots & [c_{2c}d_{2c}] \\ [c_{31}d_{31}] & [c_{32}d_{32}] & [c_{33}d_{33}] & \cdots & [c_{3c}d_{3c}] \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ [c_{m1}d_{m1}] & [c_{m2}d_{m2}] & [c_{m3}d_{m3}] & \cdots & [c_{mc}d_{mc}] \end{bmatrix} = [c_{ij}d_{ij}]_{m \times c}$$

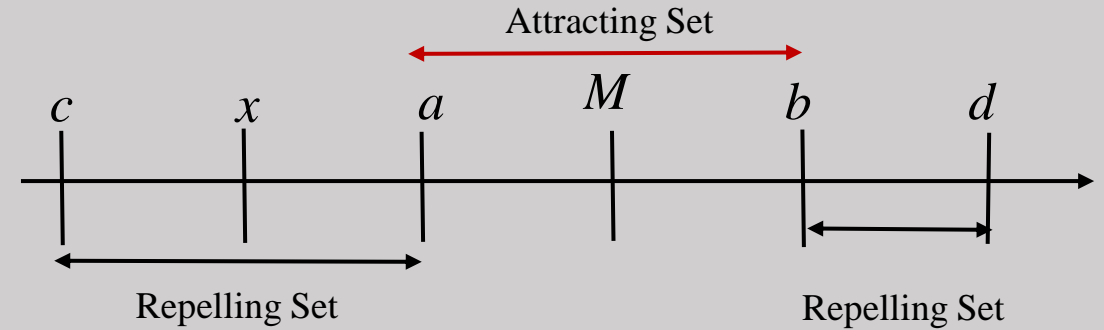
$$[c_{ij}d_{ij}] = \begin{cases} a_{ij-1}b_{ij+1}, & j-1 > 0, j < c \\ a_{i1}b_{ij+1}, & j-1 = 0 \\ a_{ij-1}b_{ic}, & j = c \end{cases}$$

## Step 3: Point value matrix

$$M_{ij} = \begin{cases} \frac{a_{ij} + b_{ij}}{2} & j \neq 1, c \\ a_{ij} & j = 1 \\ b_{ij} & j = c \end{cases}$$

## Calculation of Degree of Exposure using VFS Theory

### Step 4: Relative Membership Degree (RMD)



When  $x$  is located to the right of  $M$ , then relative membership function can be expressed as:

$$\mu_A(u) = 0.5 \times \left\{ 1 + \frac{(x-b)}{(M-b)} \right\}^\beta, \quad x \in [M, b]$$

$$\mu_A(u) = 0.5 \times \left\{ 1 - \frac{(x-b)}{(d-b)} \right\}^\beta, \quad x \in [b, d]$$

When  $x$  is located to the left of  $M$ , then relative membership function can be expressed as:

$$\mu_A(u) = 0.5 \times \left\{ 1 + \frac{(x-a)}{(M-a)} \right\}^\beta, \quad x \in [a, M]$$

$$\mu_A(u) = 0.5 \times \left\{ 1 - \frac{(x-a)}{(c-a)} \right\}^\beta, \quad x \in [c, a]$$

Where,  $\beta$  is index bigger than 0, usually we take it as 1, above become linear functions.



### Step 5: Risk Assessment Matrix

The RMD matrix of the m indexes to the c levels can be calculated illustrated as follows:

$$\mu_A(u)_{m \times c} = \begin{bmatrix} \mu_A(u)_{11} & \mu_A(u)_{12} & \mu_A(u)_{13} & \cdots & \mu_A(u)_{1c} \\ \mu_A(u)_{21} & \mu_A(u)_{22} & \mu_A(u)_{23} & \cdots & \mu_A(u)_{2c} \\ \mu_A(u)_{31} & \mu_A(u)_{32} & \mu_A(u)_{33} & \cdots & \mu_A(u)_{3c} \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ \mu_A(u)_{m1} & \mu_A(u)_{m2} & \mu_A(u)_{m3} & \cdots & \mu_A(u)_{mc} \end{bmatrix}$$

### Step 6: Synthetic Relative Membership Degree (SRMD)

$$\mu'_h = \left\{ 1 + \left[ \frac{\sum_{i=1}^m [\omega_i (1 - \mu_A(x_i)_j)]^p}{\sum_{i=1}^m [\omega_i (\mu_A(x_i)_j)]^p} \right]^{\frac{\alpha}{p}} \right\}^{-1}$$

SRMD can be calculated using variable fuzzy synthetic evaluation model.

### Step 7: Normalized SRMD

$$\beta_j = \frac{\beta'_j}{\sum_{j=1}^c \beta'_j}, (j = 1, 2, 3, \dots, c)$$

### Step 8: Level feature value (H) using rank feature values (RFV) equation (Chen, 1998)

$$H = (1, 2, 3, \dots, c) \blacksquare \beta \quad H = \sum_{j=1}^c \beta_j \times j, (j = 1, 2, 3, \dots, c)$$

### Step 9: Calculation of exposure degree by discrimination rule

$$\begin{aligned} 1 < H < 1.5 & , \in \text{grade 1} \\ j - 0.5 < H < j + 0.5 & . \in \text{grade } j, j = 1, 2, 3, \dots, c \\ c - 0.5 < H < c & , \text{grade } c \end{aligned}$$

### Step 10: Calculation of Risk Rate (Type 1)

$$\begin{aligned} \text{Likelihood} & \rightarrow A_i \rightarrow \langle a_{i1}, a_{i2}, a_{i3} \rangle \\ \text{Hazard severity} & \rightarrow B_i \rightarrow \langle b_{i1}, b_{i2}, b_{i3} \rangle \\ \text{Exposure} & \rightarrow C_i \rightarrow \langle c_{i1}, c_{i2}, c_{i3} \rangle \\ \text{Risk rate} & \rightarrow g = A \otimes B \otimes C \\ g & \rightarrow \langle a_1 b_1 c_1, a_2 b_2 c_2, a_3 b_3 c_3 \rangle \rightarrow \langle l_i, m_i, u_i \rangle \\ g_i & = \frac{[Lw_i + Mw_i + Uw_i]}{3} \end{aligned}$$



## Step 10: Calculation of Risk Rate (Type 2)

$$\text{Risk rate} \rightarrow g_{\text{improved}} = \sqrt[3]{A \otimes B \otimes C}$$

## Step 11: Fuzzy Risk assessment matrix

Let  $V = \{V_1, V_2, V_3, V_4, V_5\}$  be the set of rating for each risk item (exposure index). By fuzzy relation on  $C \times V$ ; the fuzzy assessment matrix (M) for  $C \times V$  is established

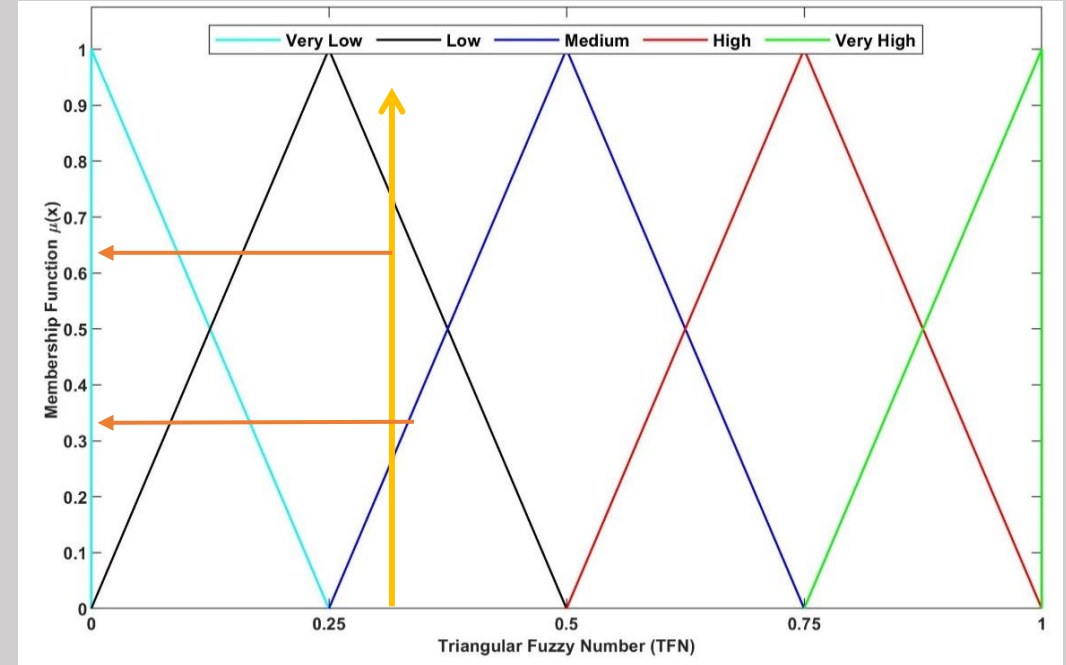
$$M = \begin{matrix} & V_1 & V_2 & V_3 & V_4 & V_5 \\ \begin{matrix} C_1 \\ C_2 \\ \vdots \\ \vdots \\ C_N \end{matrix} & \begin{matrix} V(A, B_1, C_1, 1) \\ V(A, B_2, C_2, 1) \\ \vdots \\ \vdots \\ V(A, B_N, C_N, 1) \end{matrix} & \begin{matrix} V(A, B_1, C_1, 2) \\ V(A, B_2, C_2, 2) \\ \vdots \\ \vdots \\ V(A, B_N, C_N, 2) \end{matrix} & \begin{matrix} V(A, B_1, C_1, 3) \\ V(A, B_2, C_2, 3) \\ \vdots \\ \vdots \\ V(A, B_N, C_N, 3) \end{matrix} & \begin{matrix} V(A, B_1, C_1, 4) \\ V(A, B_2, C_2, 4) \\ \vdots \\ \vdots \\ V(A, B_N, C_N, 4) \end{matrix} & \begin{matrix} V(A, B_1, C_1, 5) \\ V(A, B_2, C_2, 5) \\ \vdots \\ \vdots \\ V(A, B_N, C_N, 5) \end{matrix} \end{matrix}$$

## Step 12: Evaluation of Aggregative Risk:

$$[R]_{1 \times 5} = [W]_{1 \times N} \times [M]_{N \times 5}$$

$[W]$  = Weight vector of Sub criteria estimated using AHP and FAHP.

$[M]$  = Fuzzy Risk assessment matrix

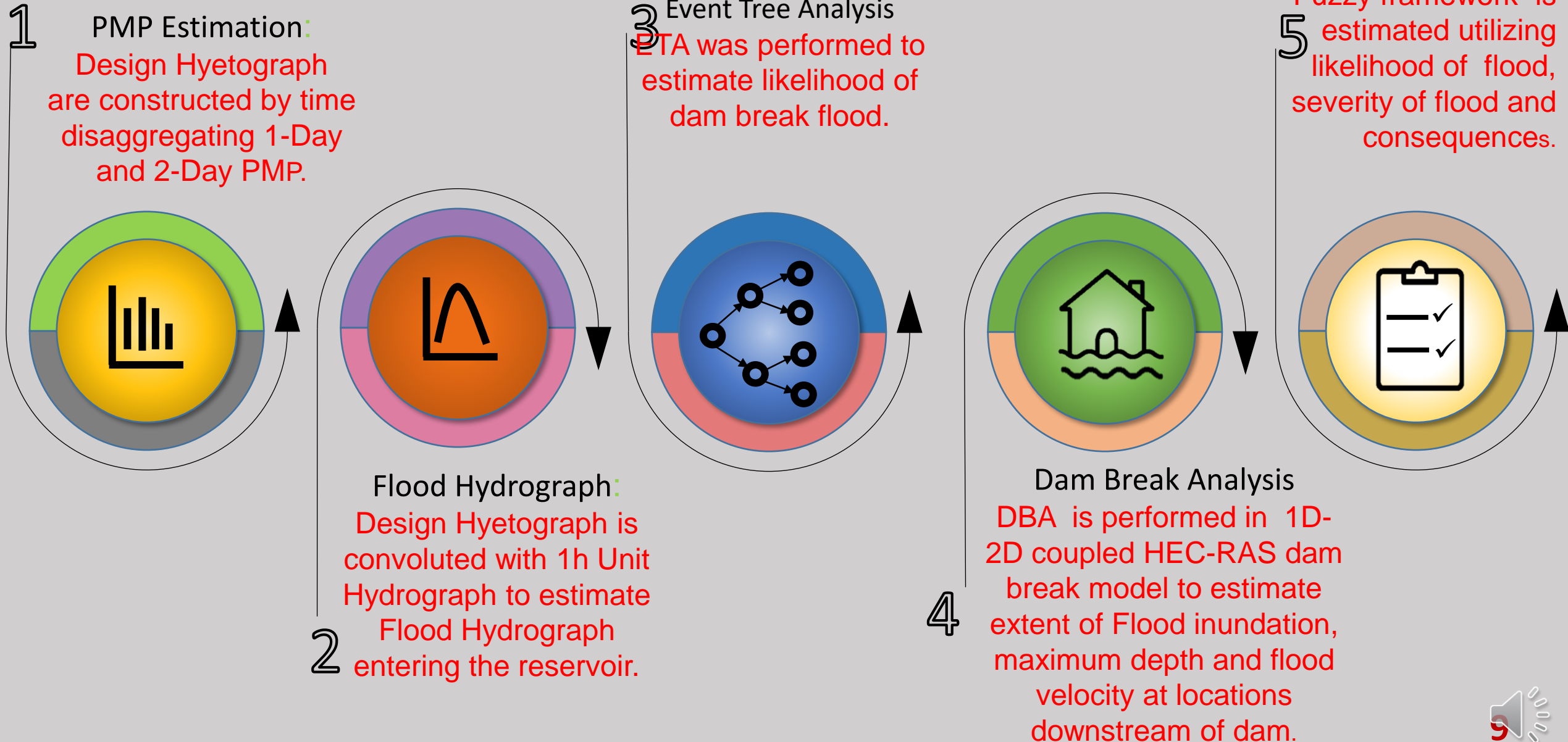


## Step 13: Calculation of Risk Index using RFV equation (Chen, 1998)

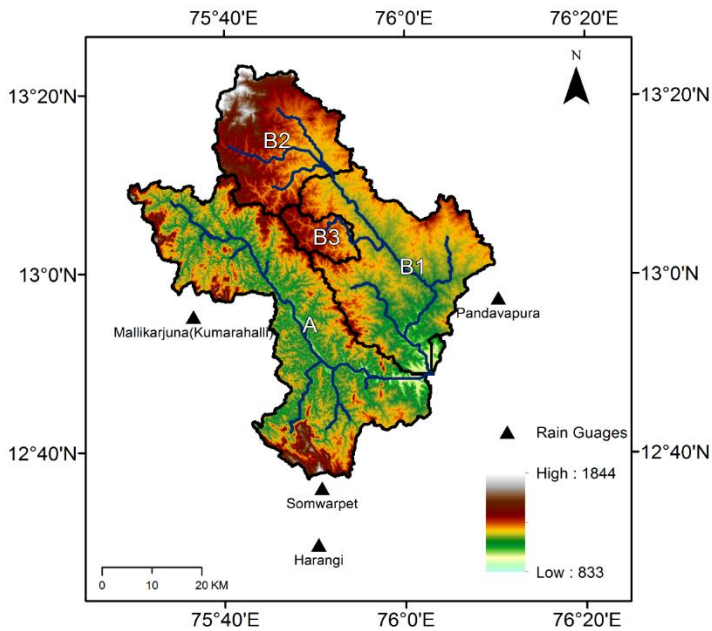
$$RI = [1 \ 2 \ 3 \ 4 \ 5] \times [R]_{1 \times 5}$$

Evaluation Level	Risk Index
Very Low	$1.0 < RI < 1.5$
Low	$1.5 < RI < 2.5$
Moderate	$2.5 < RI < 3.5$
High	$3.5 < RI < 4.5$
Very High	$4.5 < RI < 5.0$

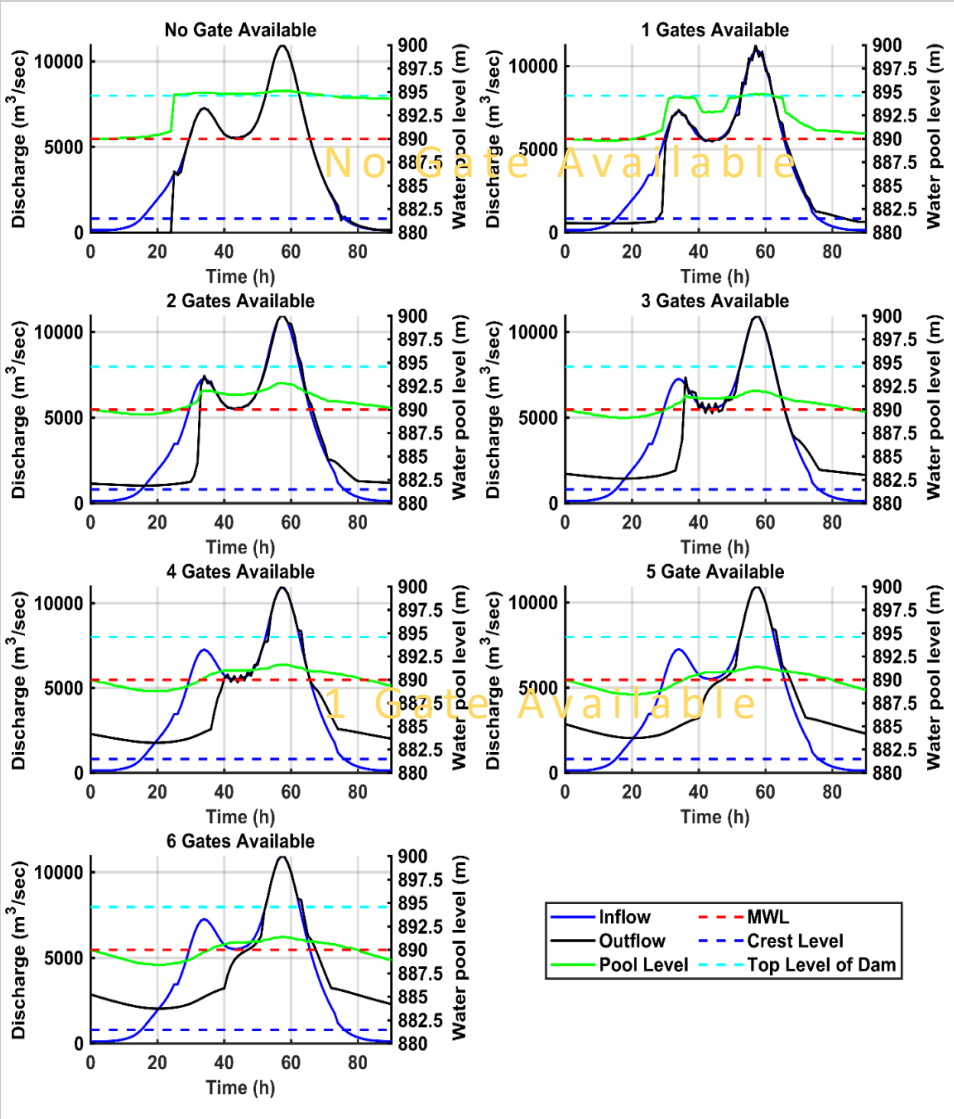




Catchment Plan of Hemavathy Dam.

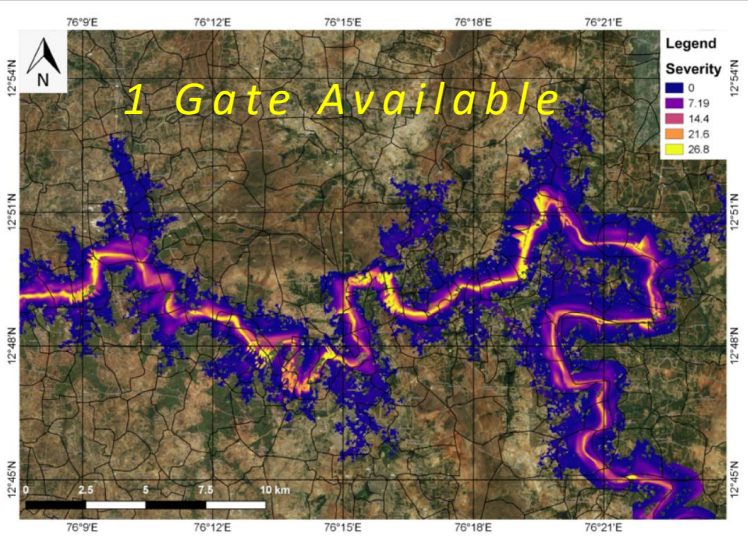
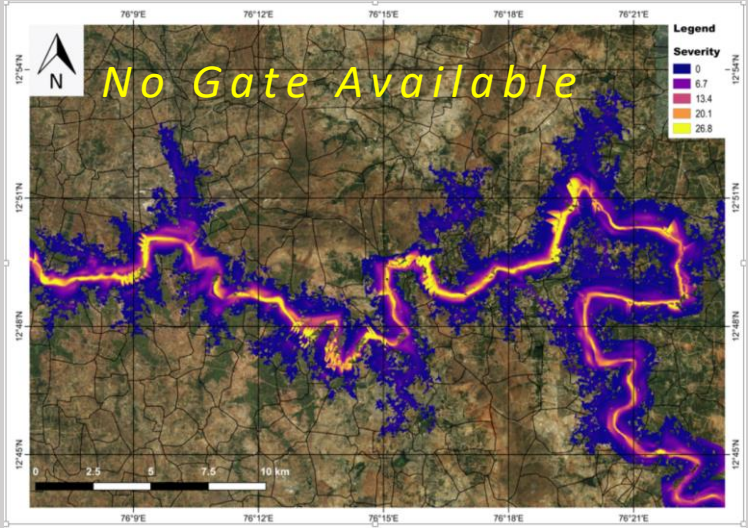


River	Hemavathy	Full Reservoir Level	890.62 m
Longitude/Latitude	76°03' E/ 12°45' N	Min. Drawdown Level	872.33 m
Capacity of Spillway	3624.55 cumecs	No. of Spillway Gates	6
Type of Dam	Earthen + Gravity Dam	Type of Spillway Gates	Radial
Length of Dam	4692 m	Size of Spillway Gates	10.67m x 15.24m
Height of Dam	58.5 m	Shape of Spillway	Ogee
Catchment Area	2810 Sq. Km	Length of Spillway	94.5 m



Flood Routing Calculation corresponding to design flood based on each case of gate availability, ranging from 0 to 6. for Hemavathy reservoir project

Results

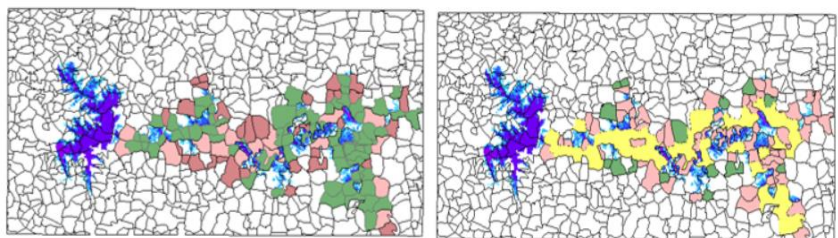
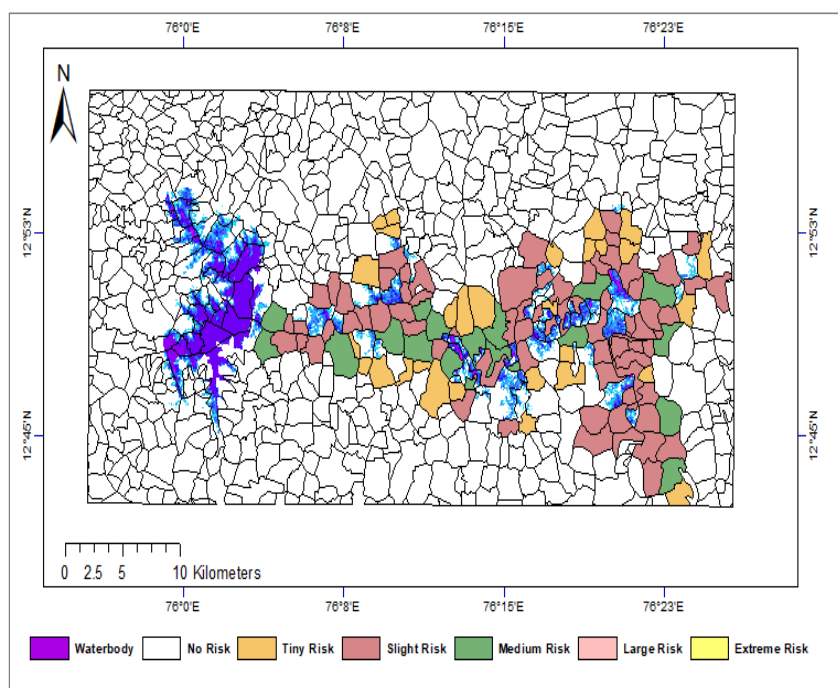


Flood inundation map showing maximum severity



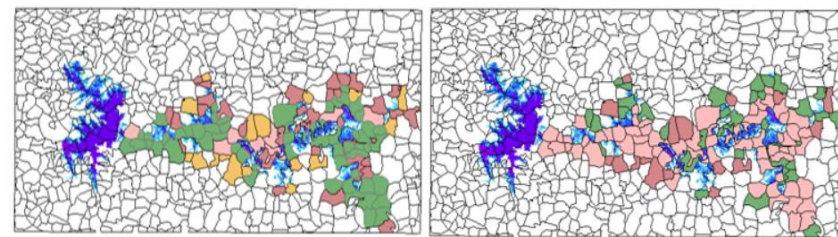


## No Gate Available



(b.)

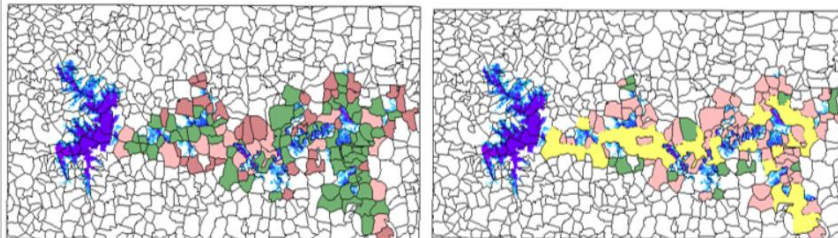
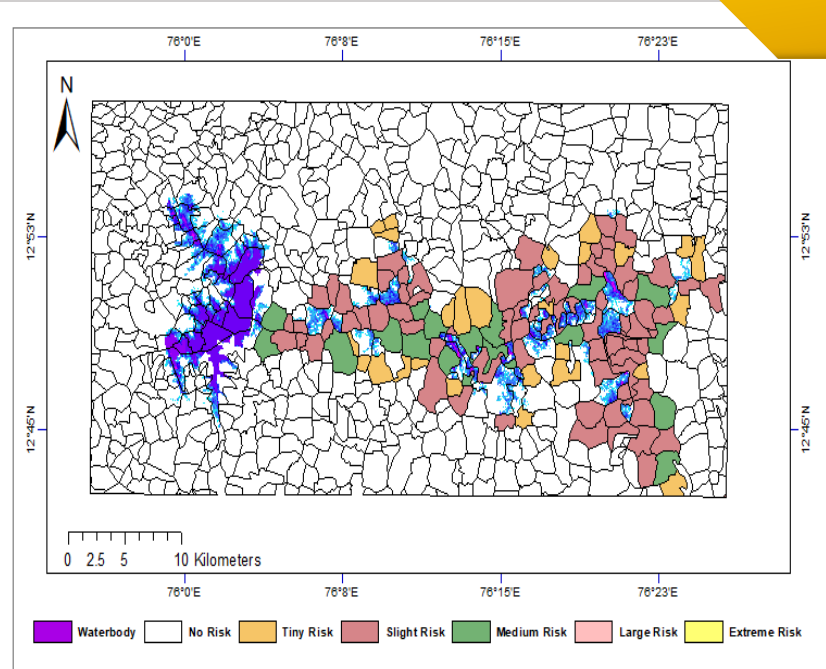
(c.)



(d.)

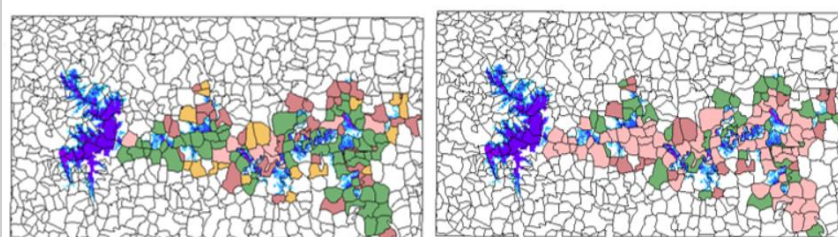
(e.)

## 1 Gate Available



(b.)

(c.)



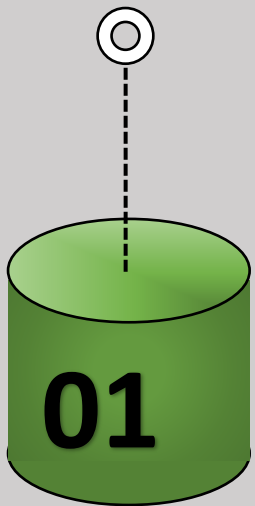
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(e.)

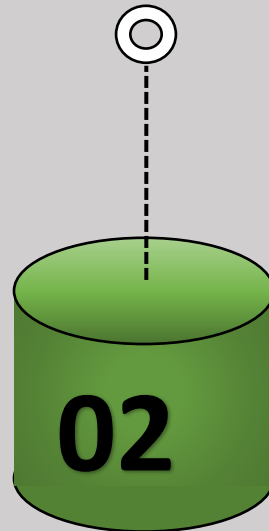
## Village Wise Aggregative Risk Index (VW-ARI)

- Method 1: Conventional method for estimating ARI based on SFS theory (Type 1).
- Method 2: Modified Conventional method for estimating ARI based on SFS theory (Type 2).
- Method 3: ARI based VFS theory.
- Method 4: ARI based on integration of SFS and VFS theory (Type 1)
- Method 5: ARI based on integration of SFS and VFS theory (Type 2)

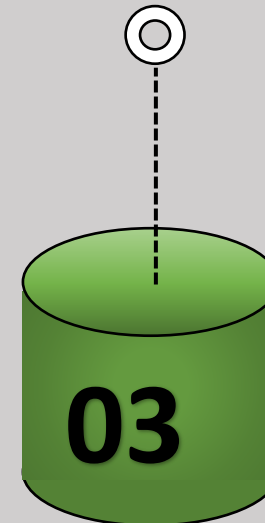
ARI based solely on VFS theory results in over estimation of Risk as compared to Risk based on integration of SFS and VFS theory.



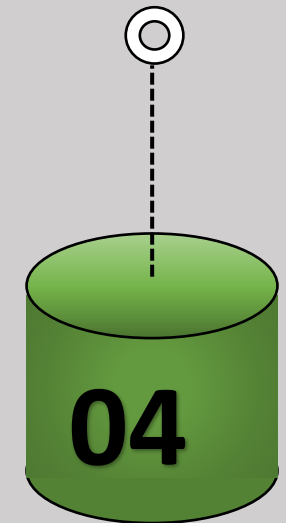
ARI based on Type 1 method results in under estimation of risk as compared to Risk based on Type 2 method.



ARI based on integration of SFS and VFS theory (Type 2) is preferred as the estimated risk is reasonable and it takes into account the influence of uncertainties / vagueness associated with linguistic classification of Risk Items.



Weights calculated using Fuzzy AHP are more reliable as they take into account uncertainty associated with subjective pairwise comparison matrix



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# Thank You



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