### <sup>1</sup>Jamilu Ya'u, <sup>2</sup>Abdullahi Ibrahim Getso <sup>1</sup>Musa Mohammed, <sup>1</sup>Ibrahim Inuwa Musa <sup>3</sup>Munnir Tukur Baba

<sup>1</sup>Department of Building Technology Abubakar Tafawa Balewa University Bauchi <sup>2</sup>Department of Building Ahmadu Bello University Zaria <sup>3</sup>Department of Building Technology Nuhu Bamalli Polytechnic Zaria

### Abstract

Structural safety estimation is a task of paramount importance, especially in recent situations where adding additives to improve the properties of concrete has become the order of the day. In this paper, the stochastic variables were identified; the variables obtained were obtained under laboratory experiments and assumed to be stochastic. Python programming language was used in Jupyter Notebook (code translator), and math was imported as a Python library for the evaluation of safety indices and failure probabilities of reinforced concrete beams produced with metakaolin. The obtained geometric indices were found to be 3.2967, 3.6428, 3.219, and 3.0176, and the failure probabilities corresponding to the estimated geometric indices were 1.65E-3, 1.83E-3, 1.62E-3, and 1.51E-3 for reinforced concrete beams produced with 0%, 10%, 20%, and 30% replacements of cement with metakaolin, respectively. The values are less than the target safety index of 4.7 for beams in bending or flexure and 3.7 for beams in shear, with tolerable risk levels (10–3) for structural elements. The results showed that the structural elements are unsafe and can lead to a severe accident compared to the prediction of structural performance according to the specifications of the Joint Committee on Structural Safety (JCSS) (2001).

*Keywords:* - Structural Safety, Building Process, Stochastic Analysis, Reliability Evaluation, Metakaolin, Python programming

#### Introduction

Reliability appraisal of structures becomes a necessity, especially in Nigeria, where several building collapses were reported due to the use of quacks and substandard materials in the construction industry (Faremi and Ajayi 2020). One of the major construction materials used in the construction industry is cement, and the use of cement is associated with the emission of Co2.

Shan, Zhou, Meng, Mi, Liu and Guan (2019) research was conducted to carve out the amount of CO2 emissions due to the production of cement, which brought in the concept of using metakaolin as a partial replacement for cement as an additive (Barbosa, dos Anjos, Cabral and Dias, 2022). Yet, some professionals and quacks still abuse the concept of the use of additives in the construction industry and use them beyond the recommendable value specified in research publications and standard documents. This exposes some of the structures produced with additives to the risk of failure, and such structures' safety is not guaranteed.

The best way to assess the safety of a structure or structural element is by calculating the probability of failure (Yang,

Teng and Frangopol, 2017). Given that it is not possible to predict structural loading and intensities with absolute certainty, the probabilistic concept has become a crucial tool for any realistic, quantitative, and logical investigation, and every conceivable circumstance must be accompanied by a numerical estimate of the likelihood that it will occur. (Onwuka and Sule, 2014). This metric can only determine the structural importance of a given condition.

Since absolute reliability is impossible in an uncertain world, evaluating structural safety using a probabilistic approach makes sense, according to Onwuka and Sule (2014). The main goal of probabilistic thinking has been to evaluate uncertainty's effects on structural performance systematically. Although it may not have all the answers, the probabilistic idea has been essential in establishing the viability of many engineering structures. (Ross, Booker, Parkinson, 2002). This paper highlights the use of probabilistic concepts to assess the structural integrity of reinforced concrete beams produced with metakaolin. The probabilistic model is simple and straightforward and can be manually achieved.

structural elements produced with cement, sand, aggregate, and steel reinforcements was investigated by Renjian et al. (1994), Mohammed et al. (2014), Onwuka and Sule (2014), Kigha et al. (2014), Farsani and Keshtegar (2015), Aboshio, Uche and Ogork (2016), Mahdi (2017), Ya'u, Okoli, Dahiru and Mohammed (2021).

# Mix Design of Concrete and sample preparation

The British Method of Concrete Mix Design (DoE Method 1988) of concrete mix design was used to determine the quantities of the materials for concrete samples of different grades. The mix proportions are presented in Table 1.

Table 1: Mix Proportion of Concrete Samples
---

Concrete	Cement	Sand	Coarse	Water	W/C ratio	Metakaolin
Grades	$(Kg/m^3)$	$(Kg/m^3)$	Aggregate	content		replacement
			$(Kg/m^3)$	$(Kg/m^3)$		(°/ <sub>0</sub> )
C25	360	693.89	1207.35	190	0.53	10-30

### **Experimental Design**

In preparing specimens, grade 25 was prepared, including control, 10%, 20%, and 30% cement replacement with metakaolin. Each category contained nine (9) specimens, which sum up to thirty-six (36) cubes and thirty-six (36) beams.

The sizes of the specimen cast were 150 mm x 150 mm x 150 mm cubes and 150 mm x 750 mm x 150 mm beams. Details of the experimental design are shown in Tables 2 and 3.

	Table 2: Percent	Content	of Metakaolin in Cube Spe	ecimens for Grad	de 25	
Ī	MK (%)	0 %	10%	20%	30%	
	Curing days					
-	7 days	Cube	Cube	Cube	Beam	
	14 days	Cube	Cube	Cube	Beam	
	28 days	Cube	Cube	Cube	Beam	

Table 3: Percent Content of Metakaolin in Beam Specimens for Grade 25						
MK (%)	0 %	10%	20%	30%		
Curing days						
7 days	Beam	Beam	Beam	Beam		
14 days	Beam	Beam	Beam	Beam		
28 days	Beam	Beam	Beam	Beam		

#### **Formulation of Stochastic Model**

Let X, Y and be the applied stress random variable and allowable stress random with statistical properties described by the first and second moment

 $(\mu_x, \sigma_x)$  and  $(\mu_y, \sigma_y)$ , respectively.

The limit state function is given by: YXZ-= (1)

Violation of limit state occurs when: 0>z (2)

Again, using equation (1), the probability of failure is given by:

The probability of failure is given by:

$$P_{f} = \int_{0}^{\infty} g(z) dz$$
 (3)

The capacity demand is assumed to be statistically independent.

$$f(x)f(x-z)dxdz \tag{4}$$

Using equation (1) and applying the convolution theorem, the probability density function of z

$$g(z) = \int_{a}^{b} f(x)f(x-z)dxdz$$
 (5)

where represent the structural stress limits. From Figure 1, they are assumed to be normally distributed. Therefore, the probability density functions are given by equations (6) and (7) respectively [13]. b and a Y and X (

$$f(x) = \frac{1}{\sigma_x \sqrt{2\pi}} \exp\left[-\frac{1}{2}\right] \left(\frac{x - \mu_x}{\sigma_x}\right)^2 \qquad (-\infty, \infty) \quad (6)$$

$$f(y) = \frac{1}{\sigma_y \sqrt{2\pi}} \exp\left[-\frac{1}{2}\right] \left(\frac{x - \mu_y}{\sigma_y}\right)^2 \quad (-\infty, \infty)$$
(7)

Substituting for using equation f(x) and  $f(x-\overline{z})$ 

$$g(x) = \int_{-\infty}^{\infty} \frac{1}{2\pi\sigma_x \sigma_z} \exp\left[-\frac{(x-\mu_x)^2}{2\sigma_x^2} - \frac{x-z-\mu^2}{2\sigma^2}\right] dx$$
(8)

Let the expression in the bracket be denoted by  $\lambda$ Therefore,

$$\lambda = -\frac{(x - \mu_x)^2}{2\sigma_x^2} - \frac{(x - z - \mu_x)^2}{2\sigma_y^2}$$
(9)

Multiplication of the top and bottom of equation (9) by  $\sigma_x^2 + \sigma_y^2$  gives:

$$\lambda = \frac{\sigma_{x}^{2} + \sigma_{y}^{2}}{2\sigma_{x}^{2}\sigma_{y}} \left( \frac{-2\sigma_{y}^{2} (x - \mu_{x})^{2} - 2\sigma_{x}^{2} (x - z - \mu_{y})^{2}}{\sigma_{x}^{2} + \sigma_{y}^{2}} \right)$$
(10)

Jamilu / Abdullahi / Musa / Ibrahim / Munnir

$$\lambda = \frac{\sigma_{x}^{2} + \sigma_{y}^{2}}{2\sigma_{x}^{2} 2\sigma_{y}} \left[ \frac{x^{2} - 2x(\mu_{x}\sigma_{z}^{2} + z\sigma_{x}^{2} + \mu_{y}\sigma_{x}^{2})}{\sigma_{x}^{2} + \sigma_{y}^{2}} + \mu_{x}^{2}\sigma_{y}^{2} + \frac{(z^{2} + \mu_{y}^{2} + 2z\mu_{z})\sigma_{x}^{2}}{\sigma_{x}^{2} + \sigma_{y}^{2}} \right]$$
(11)

Multiplying the top and bottom of the last term of equation (11) by  $\sigma_x^2 + \sigma_y^2$  gives:

$$\lambda = \frac{\sigma_{x}^{2} + \sigma_{y}^{2}}{2\sigma_{x}^{2}\sigma_{y}^{2}} \begin{cases} \frac{x^{2}2x\left[\mu^{2}x\sigma_{y}^{2} + \left(z + \mu_{y}\right)\sigma_{x}^{2}\right]}{\sigma_{x}^{2} + \sigma_{y}^{2}} \\ + \frac{\mu^{2}x\sigma_{x}^{2}\sigma_{y}\left(z^{2} + 2z\mu_{y} + \mu^{2}y\right)\sigma_{x}^{4} + \mu^{2}x\sigma_{y}^{4} + \left(z^{2} + 2z\mu_{y} + \mu^{2}x\right)\sigma_{x}^{2}\sigma_{y}^{2}}{\left(\sigma_{x}^{2} + \sigma_{y}^{2}\right)^{2}} \end{cases}$$
(12)

The separation of the two middle terms of the last fraction of equation (12) from the other two terms followed by addition and subtraction of expression

 $\frac{2\mu_x(z+\mu_y)\sigma^2_x\sigma^2_y}{(\sigma^2_x+\sigma^2_y)^2}$ 

Transforms equation (12) to:

$$\lambda = \frac{\sigma_x^2 + \sigma_y^2}{2\sigma_x^2 \sigma_y^2} \begin{bmatrix} x^2 - 2x \frac{\mu_x \sigma_y^2 + (z + \mu_y) \sigma_x^2}{\sigma_x^2 + \sigma_y^2} \\ + \frac{\mu_x^2 \sigma_y^4 + 2\mu_x (z + \mu_y) \sigma_x^2 \sigma_y^2 + (z + \mu_y) \sigma_x^4}{(\sigma_x^2 + \sigma_x^2)} \\ + \frac{\mu_x - 2\mu_x (z + \mu_y) + (z + \mu_y) \sigma_x^2 \sigma_y^2}{(\sigma_x^2 + \sigma_y^2)^2} \end{bmatrix}$$
(13)

Also, multiply the last term of equation (13) by 
$$-\frac{\sigma_x^2 + \sigma_y^2}{2\sigma_x^2 \sigma_y^2}$$

$$\lambda = -\frac{\sigma_{x}^{2} + \sigma_{y}^{2}}{2\sigma_{x}^{2}\sigma_{y}^{2}} \left( x - \frac{\mu_{x}\sigma_{y}^{2} + (z + \mu_{y})\sigma_{x}^{2}}{\sigma_{x}^{2} + \sigma_{y}^{2}} \right) - \frac{(z + \mu_{x} - \mu_{y})^{2}}{2(\sigma_{x}^{2} + \sigma_{y}^{2})^{2}}$$
(14)

$$g(z) = \frac{1}{\sqrt{2\pi} \left(\sigma_{x}^{2} + \sigma_{y}^{2}\right)} \exp \begin{cases} \frac{\sigma_{x}^{2} + \sigma_{y}^{2}}{\sigma_{y}^{2} y^{2}} \left[x - \frac{\mu_{x} \sigma_{y}^{2} + (z + \mu_{y}) \sigma_{x}^{2}}{\sigma_{x}^{2} + \sigma_{y}^{2}}\right] \\ - \frac{(-z - \mu_{y} - \mu_{x})}{2(\sigma_{x}^{2} + \sigma_{y}^{2})} \end{cases} dx$$
(15)

$$\alpha = \int_{-\infty}^{\infty} \frac{\sqrt{\sigma_z^2 + \sigma_y^2}}{\sqrt{2\pi\sigma_x\sigma_z}} \exp\left\{\frac{-\sigma_x^2 + \sigma_y^2}{2\sigma_x^2\sigma_z^2} \left[\frac{x - \mu_x \sigma_y^2 + (z + \mu_y)}{2\sigma_x^2\sigma_z^2}\right]^2\right\} dx$$
(16)

Equation (15) now becomes:

$$g(x) = \frac{1}{\sqrt{2\pi}\left(\sigma_{x}^{2} + \sigma_{y}^{2}\right)} \exp\left[\frac{\left(z - \mu_{y} - \mu_{x}\right)}{2\left(\sigma_{x}^{2} + \sigma_{y}^{2}\right)}\right] \alpha$$
(17)

From equation (14), let

$$t = \frac{\sqrt{\sigma_x^2 + \sigma_y^2}}{\sqrt{\sigma_x \sigma_y}} \left[ x - \frac{\mu_x \sigma_y + \left(z + \mu_y\right) \sigma_x^2}{\sigma_x^2 + \sigma_y^2} \right]$$
(18)

Differentiating t with respect to x in equation (18) yields:

$$dt = \frac{\sqrt{\sigma_x^2 + \sigma_x^2}}{\sigma_x \sigma_y} dx$$
(19)

Substituting for in equation (16), we have dx and t

$$\alpha = \int_{-\infty}^{\infty} \frac{1}{2\pi} e^{-\binom{t^2}{2}dt}$$
(20)

$$\int_{-\infty} p df dx = 1$$
(21)

Therefore, equation (15) now transforms to:

$$g(z) = \frac{1}{\sqrt{2\pi} \left( \sigma_x^2 + \sigma_y^2 \right)} \exp \left[ -\frac{1}{2} \frac{\left( z - \mu_y - \mu_x \right)}{\left( \sigma_x^2 + \sigma_y^2 \right)} \right]$$
(22)

From Figure 1, Z is a normally distributed random variable. The mean and standard deviation are therefore  $\mu_z = \mu_x - \mu_y$  (23)

$$\sigma_z = \sqrt{\sigma_x^2 + \sigma_y^2} \tag{24}$$

The probability that the structure fulfils the intended purpose is structural reliability defined by:

$$\text{Reliability} = \int_{0}^{\infty} g(z) dz \tag{25}$$

Again, let

$$t = \frac{z + \mu_y - \mu_x}{\sqrt{\sigma_x^2 + \sigma_x^2}}$$
(26)

Differentiation of equation (26) with respect to x yields:

$$dt \frac{dz}{\sqrt{\sigma_x^2 + \sigma_y^2}} \tag{27}$$

Using equation (27), equation (25) now transforms to:

Re *liability* = 
$$\int_{0}^{\infty} g(x) dz = \int_{0}^{\infty} \frac{\mu_{y} - \mu_{x}}{\sqrt{\sigma_{x}^{2} + \sigma_{y}^{2}}} - \frac{1}{2\pi} e^{-(t/2)dt}$$
 (28)

Using equation (28), the transformation which relates  $\mu_x, \mu_y$  to the standard normalised variable is given by z

$$z = \frac{\mu_y - \mu_x}{\sqrt{\sigma_x^2 + \sigma_y^2}}$$
(29)

Applied stress = 0

Therefore,

$$y = \mu_y = \sigma_y = 0 \tag{30}$$

$$z = \frac{|\mu_x|}{\sigma_x}$$
(31)

ATBU Journal of Environmental Technology 16, 1, June, 2023

49

 $\sigma_{cu}$  and x represent the concrete cube strength of control and strength of concrete containing metakolin

According to BS 8110 [11], the mean design strength is given by:  $\mu_x = 0.67\sigma_{cu}$  (32)

The resulting coefficient of variation of concrete strength is supplied as follows: error in the defined reliability mode, error resulting from test procedures, error resulting from in-batch variability of concrete strength reinforcement, and error resulting from dimensional variability.

$$COV_{\text{Re sul tan }t} = \left(COV^{2}_{y} + COV^{2}_{\text{testing}} + COV^{2}_{\text{in-batch}}\right)^{\frac{1}{2}}$$
(33)

 $\sigma_x \mu_x$  Mean value and standard deviation of structural capacity, respectively.

 $COV_{y}$  is a function of the mix design

According to Ranganathan  $COV_{testing} = COV_{in-batch} = 0.10$ 

 $X < \sigma_{all}$  Therefore, the probability of failure for a particular structural  $(P_{fi})$  for a particular structural member is given as:

$$(P_f) = P(x_i < \sigma_{all})$$
(34)

Where:

 $P,\sigma_{all}$  Represents probability operator and allowable concrete stress in axial compression, respectively.

$$P_{fi} = P(x_i < \sigma_{all}) \tag{35}$$

According to BS8110

$$\sigma_{all} = 0.33\sigma_{cu} \tag{36}$$

Assuming X to be normally distributed, the probability of failure in the structure is given by:

$$P_f = \phi \left( \frac{\sigma_{all} - \sigma_x}{\sigma_x} \right)$$
(35)

Using equations (32) and (35), equation (36) can be written as:

$$P_{f} = \phi \left( \frac{0.33\sigma_{cu} - 0.67\sigma_{cu}}{COV_{\text{Resultant}} \left( 0.67\sigma_{cu} \right)} \right), \qquad \sigma_{x} = COV_{\text{Resultant}} \times 0.67\sigma_{cu}$$
(37)

ATBU Journal of Environmental Technology 16, 1, June, 2023

50

(40)

According to Ranganathan [2], the probability of structural failure can be approximated as:

$$P_{f} \approx \phi(-\beta) \tag{39}$$

Where:

 $\phi$  (.) is the standard Gaussian cumulated function and

$$\beta = \min \|u\| = \left(\sum_{i=1}^{n} (X_i)^2\right)$$

## Results and Discussion Parameter Identified for Reliability Analysis

Table 4: Parameter Identified for Reliability Analysis

Parameter	Variable	Distribution	Mean	STD	Cov.	JSCC (2000)
X1	Fcu <sub>25</sub>	Normal	(25.21-15.11)	2.30886	0.09	Lognormal
X2	Qk (Variable	Gumbel	N/mm <sup>2</sup> (234.82- 156.38) kN/m	7.84793	0.03	Normal Gumbel or Frechet
X3	Gk25,	Log-normal	0.65156- 0.57393)	0.021194	0.04	Lognormal or Normal
X4	В	Normal	153.46 mm	4.22	0.027	Lognormal or Normal
X5	$d_{e\!f\!f}$	Normal	124.93 mm	5.13	0.040	Lognormal or Normal
X6	leff	Log-normal	453.7 mm	2.983	0.00657482	Lognormal or Normal
X7	fy	Log-normal	727.24 N/mm <sup>2</sup>	13.14	0.0189	Lognormal or Normal

Table 4 shows the parameters identified for reliability analysis, and it can be seen from the table that the concrete compressive strength and the steel yield strength have a normal distribution. These findings are not in line with those of Yusuf (2002), Farsani and Keshtegar (2015), and Kioumarsi *et al.* 

(2017). It is also observed from the table that the self-weight of the beams has a normal distribution; this finding agrees with the finding of Kioumarsi *et al.* (2017), who noted that the self-weight of beams has a normal distribution. Furthermore, distributions of section width and height are

Safety Determination of Structural Components Made With Metakaolin

obtained as normal, and these findings are also in agreement with the findings of Farsani and Keshtegar (2015) and Kioumarsi *et al.* (2017) and disagree with Yusuf (2002), who noted the section width is lognormal. The live load was obtained to have a normal distribution, which disagrees with Mohammed *et al.* (2014), Kioumarsi *et al.* (2017), and Yusuf (2002), who identified the live load as having a Gumbel distribution. This may be due to the fact that in the assignment of distribution models to a random variable, two or more distributions may appear to be plausible probability distribution models, according to Mohammed. (2014) Ya'u, Okoli, Dahiru, and J. M. Kaura (2021)

**Table 5:** Variation of safety indices and probability of failure as against variation of strength of concrete with higher percentage of metakaolin

		0 1	e		
Grade of	Mean	STD/	COV	Probability of	Safety index
concrete	(N/mm2)	(N/mm2)		failure	(-β)
With percentage	(µ, )	( <b>o</b> , )		Pf	
of Metakaolin					
25 with 0% of	25.10N/mm2	2.797147	0.111	1.65E-3	3.2967
MK replacement					
25 with 10% of	25.21N/mm2	2.30886	0.091	1.85E-3	3.6428
MK					
replacement					
25 with 20% of	18.763N/mm2	2.16583	0.115	1.62E-3	3.2319
MK					
replacement					
25 with 30% of	15.11N/mm2	1.95275	0.129	1.51E-3	3.0176
MK					
replacement					

Table 5 shows the results of safety indices and probabilities of failure of reinforced concrete beams produced with metakaolin at 0% MK replacement, 10% MK replacement, 20% MK replacement, and 30% replacement of cement. From the results obtained, reinforced concrete beams produced with 10% metakaolin have a safety index of 3.6428, which is above the minimum safety index recommended for shear but below the safety index recommended for bending, while the safety indices for 0%, 20%, and 30% replacement of cement with metakaolin are 3.2967, 3.2319, and 3.0176, respectively. It is also observed that reinforced concrete beams produced with 0% replacement of cement with metakaolin have a standard deviation of 2.797. This could be due to the variability of the material strength of the sample used

Jamilu / Abdullahi / Musa / Ibrahim / Munnir

or samples being affected by environmental factors beyond their control, which leads to a lower safety index than the sample produced with a 10% replacement of cement with metakaolin. It also confirms the sensitivity of the standard deviation to the safety index.

## Conclusion

In conclusion, the reinforced concrete beam produced with a 10% replacement of cement with metakaolin has met the minimum value of the safety index recommended by JSCC (2001) for shear failure, while reinforced concrete produced with 20% and 30% metakaolin did not meet the minimum value of the safety index for shear.

A higher coefficient of variation reduces the safety of reinforced concrete beams; therefore, stringent supervision should be carried out while producing concrete samples to minimise the risk of failure.

### References

Aboshio A., Uche O. A. U and Ogork E. N. ((2016), December). *Reliability* based calibration of safety factors for reinforced concrete staircase designed to BS 8110 (1997) paper presented at the 2<sup>ND</sup> National Engineering Conference, Faculty of Engineering, Bayero University, Kano.Decembe,(2016)

- Barbosa, M. S., dos Anjos, M. A., Cabral, K.
  C., & Dias, L. S. (2022).
  Development of composites for 3D printing with reduced cement consumption. *Construction and Building Materials*, 341, 127775.
- Farsani, M.A. and Keshtegar, B. (2015). Reliability analysis of corroded reinforced Concrete Beams Using Enhanced HL-RF Method. *Civil Fngineering Infrastructures Journal*, 48(2), 297-304.
- Faremi, O. J., Ajayi, O. O., & Faremi, O. E. (2020). Factors Influencing the Use of Substandard Materials in the Construction of Residential Buildings. CSID Journal of Infrastructure Development, 3(10), 40-50.
- JCSS, (2001). Join Committee on Structural Safety.Probabilistic Model Codes, Join Committee on Structural Safety Publication.
- Mahdi, I., Chalah, S., & Nadji, B. ((2017). Reliability study of a system dedicated to renewable energies by using stochastic petri nets: application to photovoltaic (PV) system. *Energy Procedia*, 136, 513-520.
- Mohammed, J.K, Aliyu, A.Lawan, Ibrahim A. and Mohammed, S.M. (2014).Safety of early age loaded reinforced concrete member1 *Asian journal of Engineering Technology* 2(1),2321-2462
- Onwuka D.O. and Sule, S. (2014). Stochastic Analysis of Concrete Strength In An Ongoing Construction. *American Journal of Engineering Research, 3*(1), 251-257

- Ross, T. J., Booker, J. M., & Parkinson, W. J. (Eds.). (2002). *Fuzzy logic and probability applications: bridging the gap.* Society for Industrial and Applied Mathematics.
- Renjian L, Luo, Y., and Conte, J. P. ((1994)). Reliability evaluation of reinforced concrete beams.*Structural Safety*, *14*(4), 277-298. Retrived from www.futiminna.edu.ng
- Shan, Y., Zhou, Y., Meng, J., Mi, Z., Liu, J., & Guan, D. (2019). Peak cement-related CO2 emissions and the changes in drivers in China. *Journal of Industrial Ecology*, 23(4), 959-971.
- Ya'u, Okoli, Dahiru and Mohammed J.K. (2021). Reliability Analysis of Reinforced Concrete Beams Produced with Metakaolin. ATBU Journal of Environmental Technology, 14(1), 85-99-257
- Yang, D. Y., Teng, J. G., & Frangopol, D. M. (2017). Cross-entropy-based adaptive importance sampling for time-dependent reliability analysis of deteriorating structures. *Structural Safety*, 66, 38-50.