

## Documents

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**The prediction of earthquake building structure strength: Modified k-nearest neighbour employment**  
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**Abstract**

The earthquake damage brings significant effects. The resilience of buildings against the earthquake and the destruction's location is not an efficient outcome from previous research. This study applied the Modified K-Nearest Neighbor (MK-NN) in predicting the concrete structures' performance despite the earthquakes. The 2-story building prediction covered earthquake history, time, concrete quality, displacement, velocity, and acceleration. The analysis of MK-NN provided the values of Euclidean, distance calculation, validity, and weight voting towards the classification of damages as "Safe" or "Immediate Occupancy" (IO). The K values exploited were 1, 3, 5, 7, 9, and 11, and simulation data training at 10:90, 20:80, 30:70. This study revealed the highest degree of accuracy at 98.85% with K=1 and a ratio of 30:70. Simultaneously, the lowest error rate was 1.15% at a similar K value and ratio. Herein, MK-NN significantly exceeds the accuracy and error rate of KNN up to 1.02% and 0.69%, respectively. To date, the automatic calculation prototyping software was then successfully developed. Ensuring the application's accuracy, the Confusion Matrix, the Black box, and User Acceptance Test (UAT) have been performed. In a nutshell, this study provides a significant contribution to planning and information analysis of earthquake-resistant construction. © 2020 Institute of Advanced Engineering and Science. All rights reserved.

**Author Keywords**

Classification; Earthquake; Modified K-Nearest Neighbor; Performance Measurement; Prediction

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