

A Time-Adaptive Ensemble Learning Algorithm for Detecting Arteriovenous Fistula Occlusion in Hemodialysis Patients

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Arteriovenous fistula obstruction is a common problem encountered by kidney dialysis patients. Currently, the assessment of Arteriovenous fistula obstruction in clinical practice relies primarily on physical examination methods such as auscultation and palpation, which have limited accuracy due to their reliance on empirical observations. The objective of this study is to propose a self-made audio device and validate its feasibility using machine learning classification models and deep learning classification models. The study aims to train machine learning regression models and a proposed time-adaptive ensemble learning model using audio data collected during two instances of percutaneous transluminal angioplasty (PTA) procedures. The goal is to find the most suitable machine learning regression model to assist physicians in determining the degree of Arteriovenous fistula obstruction. Among the machine learning regression models, the performance of the signal features was superior to that of acoustic features in the weak learners. Therefore, subsequent regression models were trained using signal features. Among the nine machine learning regression models, the time-adaptive ensemble learning model with the highest model interpretability (R-squared, R²) achieved R² values above 0.85 for all three cases in the test set. This level of interpretability is trustworthy and can be utilized in clinical settings.

Key words: hemodialysis, arteriovenous fistula, acoustic feature analysis, time-adaptive ensemble learning algorithm



Figure 1: Position mark

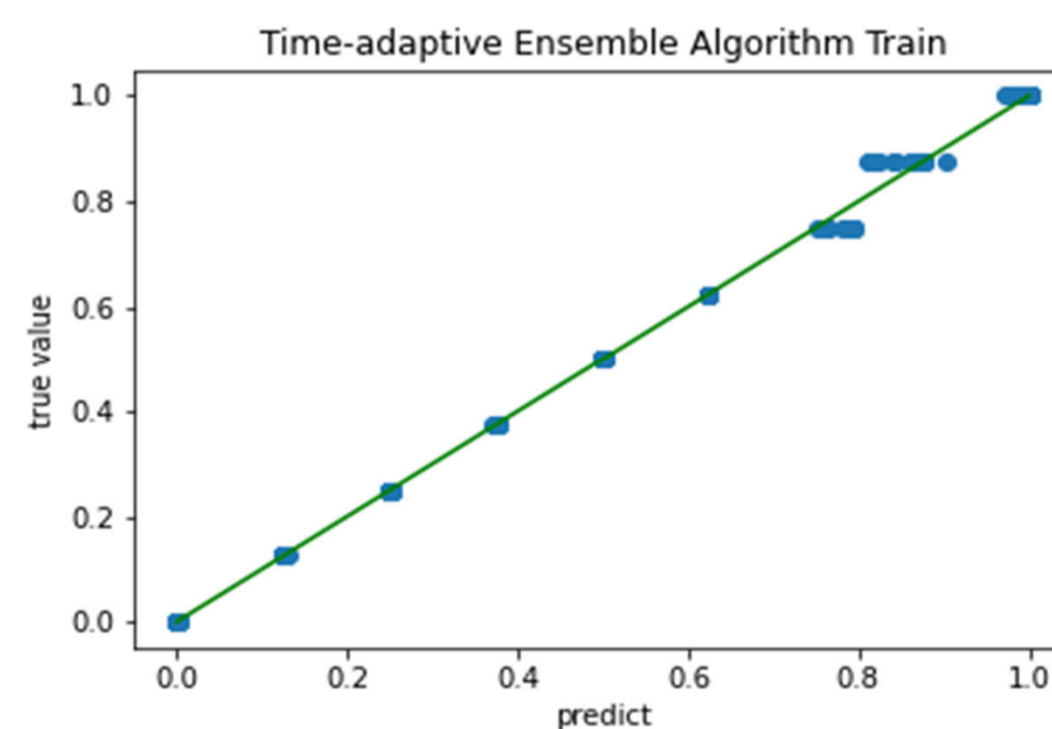


Figure 2: Training result for the proposed algorithm

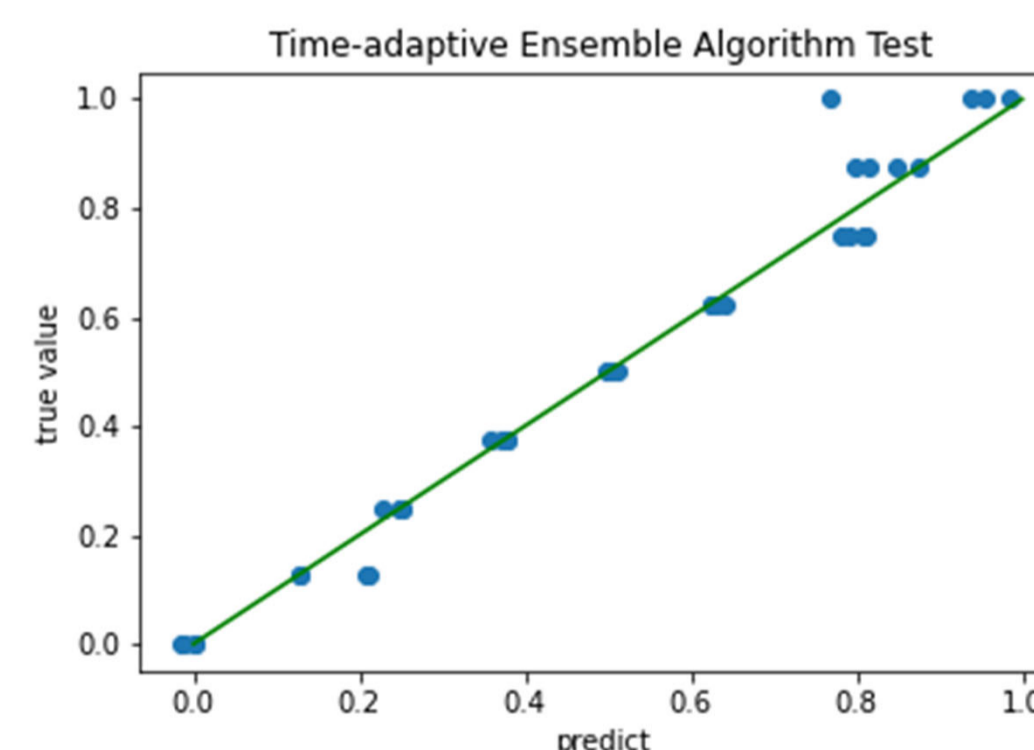


Figure 3: Testing result for the proposed algorithm