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Performance Enhancement of a Pathological Voice Quality Evaluation System Using a Self-Attention Model

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***Abstract*— Auditory-perceptual evaluation is a common assessment used for evaluating the voice quality of patients; however, it suffers from inter- and intra-rater reproducibility problems. To this end, we propose an objective evaluation metric utilizing multi-input self-attention technology to evaluate voice quality using the grade (G), roughness (R), and breathiness (B) scale. The results showed that our proposed system has better performance accuracies of 69.25% for G, 77.5% for R, and 82.25% for B, as compared to that reported in previous studies. The findings also suggests that our system serves as a potential approach for voice quality evaluation applications in the future.**

I. Introduction

The GRBAS scale is a common auditory-perceptual approach that uses five categorical traits, namely grade (G), roughness (R), breathiness (B), asthenia (A), and strain (S), to evaluate a patient's voice quality using four scales (0 to 3). Although the GRBAS scale is widely used in clinical practice, it suffers from a critical problem of subjectivity; hence, inter- and intra-rater issues [1] often appear in real application conditions when using this scale. We believe that an objective evaluation metric can alleviate this issue. Following this concept, we proposed a voice quality evaluation system using deep learning. We aim to provide patients with voice therapy a highly accurate and objective system to quantify the progress of their therapy based on voice quality evaluation.

II. Method

Fig. 1 shows the flow chart of our proposed system. As can be seen, we have used the multi-input self-attention model in our system [2]. Specifically, the multi-input self-attention model considers the relationship between pitch, vowel, and time sequence of sustained phonations. Two critical units, namely long short-term memory (LSTM) and self-attention model, are used in our system. The Saarbrücken voice database [3] was used to train and test the proposed system; 80% of the data used for training and 20% for testing. Furthermore, because of the traits A and S were unreliable, a simpler GRB scale was used in this database. Finally, the confusion matrix and accuracy were compared to the results of a previous study to evaluate the advantages of the proposed system [3].

III. Results

Based on the results (Fig. 2), our proposed system exhibited a higher accuracy of 69.25% on G, 77.5% on R, and 82.25% on B as compared to the baseline system [2], which showed accuracies of G, R, and B on 60.61%, 55.29%, and 60.75%, respectively. This implies that our method can evaluate the quality of voice from two aspects, namely pitch and vowel,

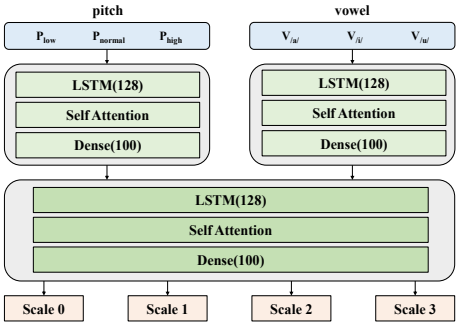

Fig. 1. Proposed system

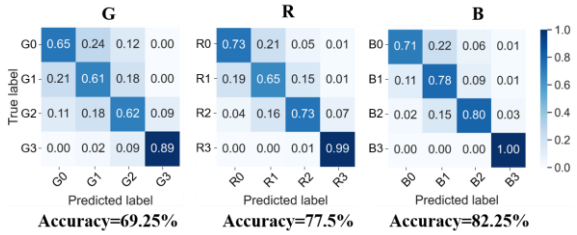

Fig. 2. Confusion matrix and the accuracy of G, R and B.

which is beneficial for addressing inter- and intra-rater issues, as mentioned earlier.

IV. Conclusion

This study proposed an objective evaluation metric for a voice quality evaluation system with a multi-input self-attention structure. The results showed that the proposed system performs better than the classical baseline system. The results also suggest that the proposed system with its multi-input self-attention structure is a potential approach for further improving the accuracy of voice quality evaluation tasks.

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