

Code-Switching Event Detection by Using a Latent Language Space Model and the Delta-Bayesian Information Criterion

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This study proposes a new paradigm for code-switching event detection based on latent language space models (LLSMs) and the delta-Bayesian information criterion (Δ BIC). In the proposed approach, acoustic feature and AF posterior probabilities for each senone segment are first extracted and then transformed to the principal components (eigenvectors) in the eigenspace by using principal component analysis (PCA). Latent semantic analysis (LSA) is then adopted to construct a matrix to model the importance of each principal component in the eigenspace for the senones and AFs in each language based on the training data. The spatial relationships among the senones (or AFs) represented by the PCA-transformed eigenvalues in the LSA-based matrix are employed to construct a latent language space model (LLSM) for characterizing a language. Based on this notion, in the detection phase, the acoustic features (or AFs) in the recognized senones of an input speech utterance are PCA-transformed to the eigenspace to form an input senone (or AF)-based sub-LLSM. The LLSM of each input speech utterance is compared with the LLSM of a target language for likelihood estimation. The Δ BIC is consequently adopted to compute the language transition score for each potential change point in the input speech utterance. To avoid an exhaustive search among all of the potential change points, the recognized phone boundaries from the automatic speech recognizer are regarded as the potential language change points. Finally, the dynamic programming algorithm is employed for identifying the most likely language sequence based on the similarities estimated from the LLSMs and Δ BIC.



Figure 1 illustrates the system framework of the proposed code-switching event detection mechanism.

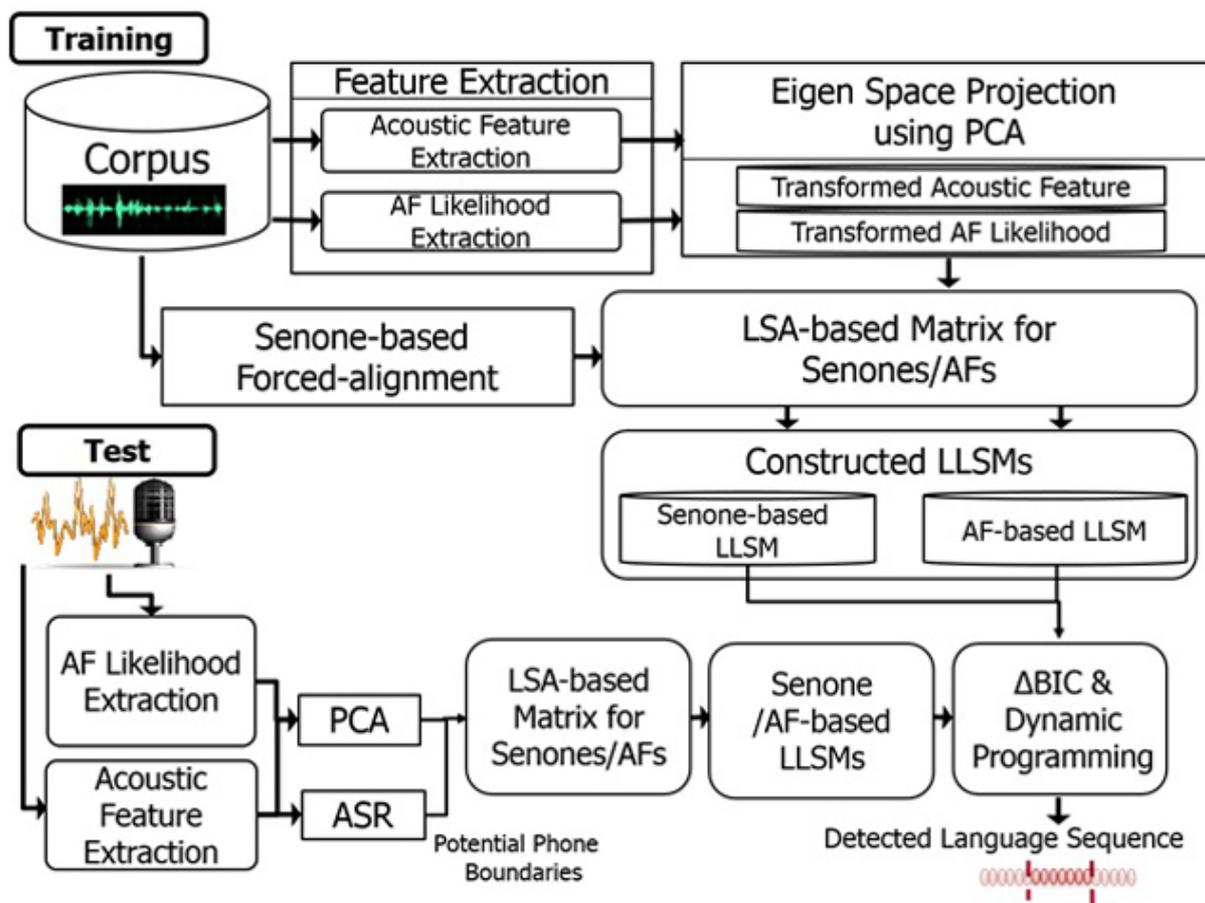


Fig.1 Illustration of the system framework of the proposed approach for code-switching event detection.

For evaluation, SVM-, GMM-, ANN-based and the proposed approaches were compared. These approaches were used to tokenize the incoming speech into language sequence. Fig. 2 presents all of the results obtained using these methods. The evaluation results indicated that the proposed method along with MFCC features mostly outperformed the other three methods using precision, recall, harmonic mean and duration accuracy.

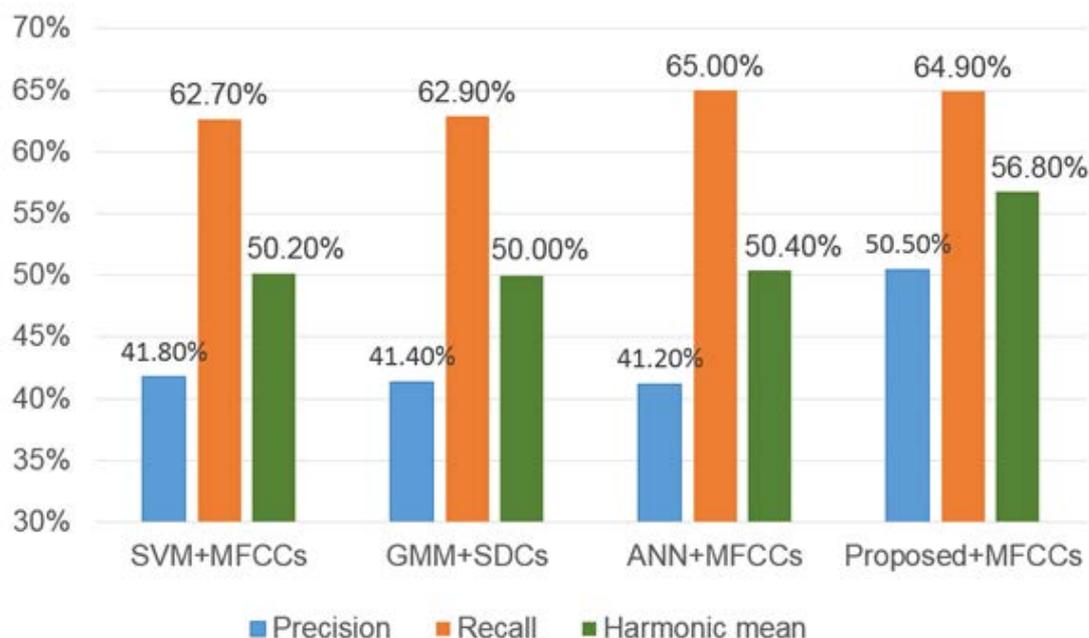


Fig. 2 Precision, recall and harmonic mean for the SVM-, GMM-, ANN-based and the proposed methods. The term following the approach is the features used.

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