Comparisons of Speech Parameterisation Techniques for Classification of Intellectual Disability Using Machine Learning

Gaurav Aggarwal, Manipal University Jaipur, Jaipur, India

https://orcid.org/0000-0003-2261-1657

Latika Singh, Ansal University, Gurgaon, India

ABSTRACT

Classification of intellectually disabled children through manual assessment of speech at an early age is inconsistent, subjective, time-consuming and prone to error. This study attempts to classify the children with intellectual disabilities using two speech feature extraction techniques: Linear Predictive Coding (LPC) based cepstral parameters, and Mel-frequency cepstral coefficients (MFCC). Four different classification models: k-nearest neighbour (k-NN), support vector machine (SVM), linear discriminant analysis (LDA) and radial basis function neural network (RBFNN) are employed for classification purposes. 48 speech samples of each group are taken for analysis, from subjects with a similar age and socio-economic background. The effect of the different frame length with the number of filterbanks in the MFCC and different frame length with the order in the LPC is also examined for better accuracy. The experimental outcomes show that the projected technique can be used to help speech pathologists in estimating intellectual disability at early ages.

KEYWORDS

Classification, Intellectual Disability (ID), Linear Predictive Coding, Mel-Frequency Cepstral Coefficients, Typically Developed (TD)

1. INTRODUCTION

In social communication, speech performs an important role to express feelings, emotions and thoughts. Communication impairments affect the process of initial cognitive development which continues to further stages. Neurodevelopment disorders, specifically, Intellectual Disability, Autism, Stuttering and Down Syndrome directly affect the speech and language development. Intellectually disabled children are highly prone to developing some speech, vocal or language disability, which has adverse effect on language development.

According to (World Health Organization, 1980), children with intellectual disability usually have impairments in language and speech which further classifies in use and comprehension of the language, deficits of the linguistic function, learning disabilities and impairments of communication. ID children also face difficulties in speech production, voice functions and speech content. The disorder

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causes restrictions in effective verbal communication which affect social involvement, educational attainment or professional performance, independently or in a group.

Communication is a vital component of quality of life, and speech considered as the primary mode of human communication out of various communication medium. In intellectually disabled (ID) children, the speech communication frequently disturbed by impairments in voice production and weakened hearing (Roberts, 2007), resulting in lack of communication and impairing both adaptive behaviour and intellectual functioning.

A authenticate clinical outcome shows the fact that a typically developing child achieve a remarkably good lexical and verbal system from their environment (De Villiers JG and De Villiers PA, 1974; Slobin, 1973; Pinker, 1994; Culter and Klein, 2005) but an ID child can't do the same at a similar age. Speech impairment is among the frequently addressed issue with the children with intellectual disability (Kumin, 2006). First, 3-5 years of a child's lifespan are highly crucial time for speech and language development. Typically developing children can learn the basic structure of language till this age (Tager-Flusburg, 1998) while children with ID can only acquire limited language components and understating of some common words. Researches on speech and language development are also affected due to less number of the speech pathologist and analyst for analysing recorded speech samples (Oller, 1980; Sheinkopf et al., 2000; Wetherby et al., 2004).

Intellectually disabled children participate in fewer activities in and outside school than their control peer groups (Abells, Burbidge & Minnes, 2008). Involvement in outside school activities is essential for all children as it enhances physical and mental growth, social awareness, and psychological security and creates community relationships (Murphy & Carbone, 2008). Children heaving intellectual disability may have lower communication, motor and social skills and have reduced cognitive functioning than their typically developed peers (Pratt & Greydanus, 2007; Westendrop, Houwen, Hartman, & Visscher, 2011). Due to less participation in outside school activities, children with intellectual disability may lead to social isolation (Rimmer, Rowland, & Yamaki, 2007) and inactive behaviour (Frey & Chow, 2006) which is generally reported in the literature.

Speech intelligibility is measured as how clear a person speaks so that his or her voice is understandable to the listener (Leddy, 1999). Lesser speech intelligibility often leads to lack of interest by others, frustration and misunderstanding. Social interaction helps in acquiring speech and language capabilities. Speech intelligibility is generally considered as voice pattern recognition in social communication (Smith, 1985). Although it is a combined effort of both speaker and listener who are participating in the recording process (Tjaden, 1995). Acquaintance with the speaker is especially helpful in case of impaired speech (Kent, 1993). Factor affecting speech intelligibility are the context of communication (e.g., verbal transmission of the voice signal, description of visual cues and related support for the signal to be transmitted) and the spoken material (e.g., length of the message and its linguistic assembly).

The children with Intellectual Disability (with mild, moderate and severe population) deficits in language development (Cardoso-Martins & Mervis, 1985; Mervis & Bertrand, 1990) in their speech. These kids also show many articulatory limitations (Stoel-Gammon, 2001) and exhibit deficits in syntax and grammar development as compared to typically developed (Singer, Bellugi, Bates, Jones & Rossen, 1997). Many neuro-anatomically and neuroimaging research studies refer to linguistic and phonological characteristics of speech of typically developing children, adults and children with Intellectual disability (Fowler, 1990). All the speech-related studies till now consider spectral acoustic features to investigate speech development (Assmann, P. F., Nearey, T. M., & Bharadwaj, 2013; Ballard, Kirrie J., et al., 2012).

In the literature, different feature extraction and classification algorithms have been implemented for classifying children with Intellectual Disability and its sub-groups (mild, moderate, severe and profound). Researches extracted MFCC and LPCC features for the classification in stuttering, Down syndrome and other language disabilities. In this research, different parameter's values of MFCC and LPC features were taken to calculate accuracy from the speech to classify children with ID from TD.

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