

Advances in Speech and Audio Processing and Coding

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Abstract—This plenary session will cover speech processing research advances with the emphasis on speech and audio coding methods. In the session, we will discuss the fundamental principles, techniques, and algorithms used in current coding applications including a summary of codecs for telecommunication standards. The session will start with a discussion on: the basic speech representation methods, the performance measures used to evaluate coded speech, and the role of the standards. Brief algorithm descriptions include: ADPCM, sub-band coding, adaptive transform coding, sinusoidal transform coding (STC), linear predictive coding (LPC), and analysis-by-synthesis LPC (sparse excitation, code excited LPC, and ACELP). The presentation will feature audio, and computer demonstrations of recent speech coding standards including voice-over IP algorithms. The plenary session will also cover wideband audio standards such as MPEG audio and other layers (e.g., MP3, AAC). Recent algorithms will also be described including the following: Variable-Rate Multimode Wideband (VMR-WB), Speex, G722.1, OGG Vorbis 2012, iLBC, SELT, SILK, Opus 2013, Qualcomm wideband 5G codecs. At the end of the session, we will cover briefly recent applications that use voice features for detecting speech pathologies, and also discuss how long-term speech parameters can be used as predictors of other diseases such as tremors, Alzheimer's etc.

Keywords—*Speech and Audio Coding, Standardized Codecs*

BRIEF SURVEY

In the following, we provide a brief survey with citations relevant to the plenary session. Basic speech analysis-synthesis principles are given in [1,2]. The basics of linear prediction are covered in [3,4,5,6]. Various first generation algorithms including the LPC-10 standard [6] are described in [7] and the references therein. The analysis-by-synthesis CELP algorithm was first introduced in [8]. The Federal standard 1016 CELP at 4.8 Kbits/s is described in [9] and MATLAB simulations with this algorithm are presented in [10]. A more recent 2.4kbits/s FS1016 is presented in [16]. Basics of vector quantization are described in [11]. Line spectral frequencies and their application in speech coding are introduced in [12,13]. Algebraic codebooks for CELP (ACELP) which use sparse excitation sequences were introduced in [14], and pitch interpolation methods for LPC are described in [15]. First generation cell phone standards are described in [7] and references therein. Second generation and third generation speech coding standards are summarized in

[17-23]. Pitch estimation is described in [4,7,24,64] and sinusoidal representations of speech are described in [25,26,27]. Educational software and simulations for speech and audio coders are presented in [28]. Perceptual determination of LPC poles is given in [29]. Bandwidth extension for low bit rate speech codecs are described in [30,31] and references therein. Recent standards including open source algorithms are described in [32-36]. Audio coding for high fidelity applications is covered in [37-39] and references therein. Principles of psychoacoustics and critical bands are described in [40-43]. Perceptual entropy theory is covered in [44]. Various audio coding standards are described in [45-56]. New applications of speech processing which provide diagnostics that can be used for detecting pathologies are presented in [57,58]. Audio analysis, synthesis and content search methods including tools for speech and audio processing are provided in [59-65].

BIOGRAPHY

Andreas Spanias is Professor in the School of Electrical, Computer, and Energy Engineering at Arizona State University (ASU). He is also the director of the Sensor Signal and Information Processing (SenSIP) center and the founder of the SenSIP industry consortium (an NSF I/UCRC site). His research interests are in the areas of adaptive signal processing, speech processing, and sensor systems. He and his student team developed the computer simulation software Java-DSP and its award winning iPhone/iPad and Android versions. He is author of two textbooks: *Audio Processing and Coding* by Wiley and *DSP; An Interactive Approach* (2nd Ed.). He served as Associate Editor of the *IEEE Transactions on Signal Processing* and as General Co-chair of *IEEE ICASSP-99*. He also served as the *IEEE Signal Processing Vice-President for Conferences*. Andreas Spanias is a co-recipient of the 2002 IEEE Donald G. Fink paper prize award and was elected Fellow of the IEEE in 2003. He served as Distinguished lecturer for the IEEE SPS in 2004. He is editor of the Morgan and Claypool algorithms and software series.

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