

# Curriculum Vitae

**Yu Tsao (曹昱)**

Assistant Research Fellow

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## RESEARCH INTERESTS

- Speech and Audio Signal Processing
- Hearing Assistive Technology (Design, Practice, and Evaluation)
- Deep Neural Network for Speech and Audio Signal Processing
- Multimedia Signal and Information Processing

## EDUCATION

GEORGIA INSTITUTE OF TECHNOLOGY, Atlanta, Georgia

*Ph.D. in Electrical and Computer Engineering*

Aug. 2003-Dec. 2008

- Major: Digital Signal Processing; Minor: Statistics
- Research Topic: Robust Speech Recognition, under advisor: Dr. Chin-Hui Lee
- Leadership Activities: President, Taiwanese Student Association (TSA): represented the school; assisted students and visiting scholars from Taiwan.

NATIONAL TAIWAN UNIVERSITY, Taipei, Taiwan

*Master of Science in Electrical Engineering*

Sept. 1999-June 2001

*Bachelor of Science in Electrical Engineering*

Sept. 1995-June 1999

- Graduate Research Topic: Rapid Speaker Adaptation, under advisor Dr. Lin-Shan Lee
- Leadership Activities: Chairman, Public Relations Department of the Student Association: organized events to cultivate strong relationships among members.

## PROFESSIONAL EXPERIENCE

RESEARCH CENTER FOR INFORMATION TECHNOLOGY INNOVATION, ACADEMIA SINICA, Taipei, Taiwan

*Assistant Researcher Fellow*

Nov. 2011-Present

- Research and develop speech, speaker and language recognition algorithms.
- Establish algorithms for acoustic and language modeling to handle mismatch caused by noises.
- Derive multimedia signal and information processing for audio and speech applications.
- Apply pattern recognition and machine learning theories on audio event detection tasks.

NATIONAL INSTITUTE OF INFORMATION AND COMMUNICATIONS TECHNOLOGY, Kyoto, Japan

*Expert Researcher*

April 2009-Sept. 2011

- Developed researches to handle non-native accent issues for automatic speech recognition applications.
- Developed digital signal processing based solutions to improve the performance of speech recognizer under real-world adverse conditions.
- Contributed to a development of VoiceTra multilingual speech to speech translation application on iPhone.
- Carried out projects of field tests and dissemination of spoken dialog interface technologies.

GEORGIA INSTITUTE OF TECHNOLOGY, Atlanta, Georgia, USA

*Research Assistant*

Aug. 2003-March 2009

- Conducted research for the Automatic Speech Attribute Transcription (ASAT) Program.
- Established detection-based automatic speech recognition framework on a smaller vocabulary database.
- Proposed a novel model-based noise robustness approach called Ensemble Speaker and Speaking Environment Modeling (ESSEM); enhanced performance robustness by characterizing noise interference.

TEXAS INSTRUMENTS INCORPORATED, Dallas, Texas, USA

*Intern, Speech Technologies Laboratory DSP Solutions R&D Center*

Summers 2004, 2005, 2006

- Contributed to a patent-pending project to develop high-performance and low-computational cost algorithms to improve efficiency and accuracy of automatic speech recognition on devices (2006).
- Reduced mismatch caused by speaker variations for mobile speech recognition applications; devised algorithms for the project (2005).
- Enhanced performance under noisy conditions for mobile speech recognition applications (2004).

APPLIED SPEECH TECHNOLOGIES (AST) COMPANY, Taipei, Taiwan

*Intern*

May 2000-July 2001

- Calculated algorithms that helped enhance the performance and reduce computational cost for a Mandarin-based speech recognition product called Mega Voice Mandarin Recognition System.

NATIONAL TAIWAN UNIVERSITY, Taipei, Taiwan

*Research Assistant, Graduate Institute of Communication Engineering*

Sept. 1999-June 2001

- Analyzed and developed segmental eigenvoice speaker adaptation approach by studying rapid speaker adaptation; created algorithms for Chinese syllables and tone adjustments for Mandarin recognition.

## **DEVELOPED TOOLS**

A smartphone-based assistive listening system, **SmartHear**, using wireless technologies for individuals with mild-to-moderate hearing loss. **SmartHear** has been developed as a **mobile application program** and is available on **Google Play**: [https://play.google.com/store/apps/details?id=van1211.mycode.test2pair&hl=zh\\_TW](https://play.google.com/store/apps/details?id=van1211.mycode.test2pair&hl=zh_TW) (since 2015, there are more than **10,000 downloads**). A demo **video** about **SmartHear** can be viewed at <https://www.youtube.com/watch?v=e9HqIj09QJs>. **SmartHear** has been reported in the Central News Agency (CNA): <http://www.cna.com.tw/postwrite/Detail/188673.aspx#.VtLmmfmqqr>.

## **HONORS**

- Top three team in BigMM 2016 Challenge, 2016.
- Co-advised Student, T.-H. Wen, Received the best paper award nomination, Interspeech 2013.
- Excellent Paper Award, Technologies and Applications of Artificial Intelligence (TAAI), 2012.
- Co-advised Student, H.-T. Hwang, Received the Interspeech 2012 Travel Grant Award, 2012.
- Fellowship from Texas Instruments Leadership University Program (TILU), 2005-2008.

## **PROFESSIONAL ACTIVITIES**

- Special Session Chair, ISCSLP 2016, Tianjin, China (2016/10).
- Workshop Co-organizer, IEEE BigMM 2016, Taiwan (2016/05).
- Co-organizer, Taiwan-Japan Symposium on Psychological, Physiological, and Electro-Acoustics, National Tsing Hua University, Taiwan (2015/10).
- Session Chair, ROCLING 2015, National Central University, Taiwan (2015/10).
- Organizer, SWS 2015, IIS, Academia Sinica, Taiwan (2015/03).
- Special Session Chair, ICASSP 2015, South Brisbane, Queensland, Australia (2015/04).
- Session Chair, ROCLING 2014, National Central University, Taiwan (2014/09).
- Session Chair, ROCLING 2013, National Sun Yat-Sen University, Taiwan (2013/10).
- Special Session Chair, APSIPA 2013, Kaohsiung, Taiwan (2013/10).
- Organizer, NGASR Workshop 2013, CITI, Academia Sinica, Taiwan (2013/09).
- Session Chair, ROCLING 2012, Yuan Ze University, Taiwan (2012/09).
- Committee Members, 2012 IEEE SPS Summer School, National Tsing Hua University, Taiwan (2012/07).
- Session Chair, ISCSLP 2010, National Cheng Kung University, Taiwan (2010/11).

## INVITED TALKS

- Deep Learning in Speech, Deep Learning Workshop in Taiwan, Academia Sinica, 2015.
- Intelligibility-oriented speech enhancement using GMAPA and maximum speech intelligibility algorithm, Taiwan-Japan Symposium on Psychological, Physiological, and Electro-Acoustics, 2015.
- Machine learning and signal processing technologies for assistive hearing devices, MediaTek Inc., 2015.
- Machine learning and signal processing technologies for assistive hearing devices, National Taiwan University, 2015.
- Some challenges and recent advances in speech technology, National Taiwan University of Science and Technology, 2014.
- Recent advances in robust speech recognition, speaker and event recognition, and voice conversion, National Tsing Hua University, 2013.
- Some challenges and recent advances in speech technology, National Sun Yat-Sen University, 2013.
- Some challenges and recent advances in speech technology, National Taiwan Normal University, 2013.
- Some challenges and recent advances in speech technology, National Central University, 2013.
- Recent advances in robust speech recognition, speaker and acoustic event recognition, and voice conversion, National Chiao Tung University, 2013.
- Challenges and recent advances in robust speech recognition, speaker and event recognition, and text classification, Nara Institute of Science and Technology, Japan, 2013.
- Some challenges and recent advances in speech technology, The University of Hong Kong, 2012.
- Some challenges and recent advances in speech technology, College of Information Science and Technology, Xinjiang University, 2012.
- Increasing discrimination on the ensemble speaker and speaking environment modeling approach for robust ASR, Tokyo Institute of Technology, Tokyo, Japan, 2009.
- MAP-based online mapping function estimation for ensemble speaker and speaking environment modeling approach, NTT Communication Science Laboratories, Kyoto, Japan, 2009.

## PUBLICATIONS

### (1) Journal Papers

#### **Published**

- [1] Y.-H. Lai, F. Chen, X. Lu, **Y. Tsao\***, and C.-H. Lee, "A deep denoising autoencoder approach to improving the intelligibility of vocoded speech in cochlear implantation," IEEE Transactions on Biomedical Engineering (SCI), accepted to appear.
- [2] S.-H. Fang, W.-H. Chang, **Y. Tsao\***, H.-C. Shih, and C. Wang, "Channel state reconstruction using multi-level discrete wavelet transform for improved fingerprinting-based indoor localization," IEEE Sensors Journal, 2016.
- [3] S.-H. Fang, H.-H. Liao, Y.-X. Fei, K.-H. Chen, J.-W. Huang, Y.-D. Lu and **Y. Tsao**, "Transportation modes classification using sensors on smartphones," Sensors, 2016.
- [4] P. Lin, S.-W. Fu, Y.-H. Lai, and **Y. Tsao\***, "Maximum entropy learning for deep belief networks," Entropy (SCI), 2016.
- [5] T.-E. Chen, S.-I. Yang, L.-T. Ho, K.-H. Tsai, Y.-H. Chen, Y.-F. Chang, Y.-H. Lai, and **Y. Tsao\***, C.-C. Wu, "S1 and S2 heart sound recognition using deep neural networks," IEEE Biomedical Engineering (SCI), 2016.
- [6] S.-S. Wang, A. Chern, **Y. Tsao\***, J.-w. Hung, X. Lu, Y.-H. Lai, and B. Su "Wavelet speech enhancement based on nonnegative matrix factorization," IEEE SPL (SCI), 2016.
- [7] H.-L. S. Wang, I.-C. Chen, C.-H. Chiang, Y.-H. Lai, and **Y. Tsao\***, "Auditory perception, suprasegmental speech processing, and vocabulary development in Chinese preschoolers," Perceptual and Motor Skills(SCI), 2016.
- [8] F. Chen, **Y. Tsao**, Y.-H. Lai, "Modeling speech intelligibility with recovered envelope from temporal fine-structure stimulus," Speech Communication (SCI), 2016.
- [9] **Y. Tsao\*** and Y.-H. Lai, "Generalized maximum a posteriori spectral amplitude algorithm for speech enhancement," Speech Communication (SCI), 2016.
- [10] S.-H. Fang, C.-H. Wang, **Y. Tsao\***, "Compensating for orientation mismatch in robust Wi-Fi localization using histogram equalization," IEEE Transaction on TVT (SCI), 2015.

- [11] Y.-C. Lin, Y.-H. Lai, H.-W. Chang, **Y. Tsao\***, Y.-p. Chang, and R. Y. Chang, "SmartHear: A smartphone based remote microphone hearing assistance system using wireless technologies," *IEEE System Journal (SCI)*, 2015.
- [12] J. Li-You, Y.-R. Chien, and **Y. Tsao**, "Rapid converging M-max partial update least mean square algorithms with new variable step-size methods," *IEICE Transactions on Communications (SCI)*, 2015.
- [13] Y.-H. Lai, Fe. Chen, and **Y. Tsao\***, "Effects of adaptation rate and noise suppression on the intelligibility of compressed-envelope based speech," *PLoS One (SCI)*, 2015.
- [14] C.-C. Hsu, K.-M. Cheong, T.-S. Chi, **Y. Tsao**, "Robust voice activity detection algorithm based on feature of frequency modulation of harmonics and its DSP," *IEICE Transactions on Information and Systems (SCI)*, 2015.
- [15] **Y. Tsao\***, P. Lin, T.-y. Hu, and X. Lu, "Ensemble environment modeling using affine transform groups for robust automatic speech recognition," *Speech Communication (SCI)*, 2015.
- [16] **Y. Tsao**, S.-H. Fang, and Y. Shiao, "Acoustic echo cancellation using a vector-space-based adaptive filtering algorithm," *IEEE Signal Processing Letter (SCI)*, 2015.
- [17] **Y. Tsao\***, T.-y. Hu, S. Sakti, S. Nakamura, and L.-s. Lee, "Variable selection linear regression for robust speech recognition," *IEICE Transactions on Information and Systems (SCI)* 2014.
- [18] **Y. Tsao\***, X. Lu, P. Dixon, T.-y. Hu, S. Matsuda, and C. Hori, "Incorporating local information of the acoustic environments to MAP-based feature compensation and acoustic model adaptation," *Computer Speech and Language (SCI)*, 2014.
- [19] **Y. Tsao\***, S. Matsuda, C. Hori, H. Kashioka, and C.-H. Lee, "A MAP-based online estimation approach to ensemble speaker and speaking environment modeling," *IEEE Transaction on ASLP (SCI)*, 2014.
- [20] Y.-H. Lai, **Y. Tsao\***, and F. Chen, "A study of adaptive WDRC in hearing aids under noisy conditions," *International Journal of Speech & Language Pathology and Audiology*, 2013, (invited paper).
- [21] **Y. Tsao** and C.-H. Lee, "An ensemble speaker and speaking environment modeling approach to robust speech recognition," *IEEE Transactions on ASLP (SCI)*, 2009.
- [22] **Y. Tsao**, S.-M. Lee, and L.-S. Lee, "Segmental eigenvoice with delicate eigenspace for improved speaker adaptation," *IEEE Transactions on SAP (SCI)*, 2005.

### **Under Revision or Submitted**

- [23] H.-y. Lee, B.-H. Tseng, T.-H. Wen, and **Y. Tsao**, "Personalizing recurrent neural network based language model by social network," submitted to *IEEE Transaction on ASLP (SCI)* (Decision: Major Revision ).
- [24] Y.-T. Tsai, B. Su, **Y. Tsao**, and S.-S. Wang, "Robust beamforming against DoA mismatch using subspace-constrained diagonal loading," submitted to *IEEE Snesors (SCI)*.
- [25] S.-W. Hsiao, H.-C. Sun, M.-C. Hsieh, M.-H. Tsai, H.-C. Lin, **Y. Tsao**, and C.-C. Lee, "A computational framework for automatic scoring of pre-service school principal's oral presentation using fusion of audio-visual information," submitted to *IEEE Transaction on Affective Computing (SCI)*.
- [26] Y.-H. Lai, **Y. Tsao**, X. Lu, Y.-T. Su, J. K.-C. Chen, M.-J. Lien, S. Y. Chen, Z.-M. Yeh, Y.-X. Chen, L. P.-H. Li, C.-H. Lee, "A deep learning-based noise reduction approach to improve the speech intelligibility for cochlear implantees under challenging listening conditions," submitted to *PlosOne (SCI)*.

## **(2) Selected International Conference Papers**

### **Acoustic modeling and speech processing**

- [1] J.-C. Hou, S.-S. Wang, Y.-H. Lai, J.-C. Lin, **Y. Tsao**, H.-W. Chang, and H.-M. Wang, "Audio-visual speech enhancement using deep neural networks," to appear in *APSIPA 2016*
- [2] S.-W. Fu, **Y. Tsao**, X. Lu, "SNR-aware convolutional neural network modeling for speech enhancement," *Interspeech 2016*.
- [3] S.-S. Wang, H.-T. Hwang, Y.-H. Lai, **Y. Tsao**, X. Lu, H.-M. Wang, and B. Su, "Improving denoising auto-encoder based speech enhancement with the speech parameter generation algorithm," *APSIPA 2015*.
- [4] H.-T. Hwang, **Y. Tsao**, H.-M. Wang, Y.-R. Wang, and S.-H. Chen, "A probabilistic interpretation for artificial neural network-based voice conversion," *APSIPA 2015*.
- [5] P. Lin, D.-C. Lyu, Y.-F. Chang, and **Y. Tsao**, "Temporal alignment for deep neural networks" *GlobalSIP 2015*.

- [6] X. Lu, P. Shen, **Y. Tsao**, C. Hori, H. Kawai, "Sparse representation with temporal max-smoothing for acoustic event detection," Interspeech 2015.
- [7] P. Lin, D.-C. Lyu, Y.-F. Chang, and **Y. Tsao**, "Speech recognition with temporal neural networks," Interspeech2015.
- [8] W.-C. Chen, P.-T. Lai, **Y. Tsao**, and C.-C. Lee, "Multimodal arousal rating using unsupervised fusion technique," ICASSP 2015.
- [9] Y.-H. Lai, S.-S. Wang, P.-C. Li, and **Y. Tsao**, "A discriminative post-filter for speech enhancement in hearing aids," ICASSP 2015.
- [10] H.-S. Lee, **Y. Tsao**, H.-M. Wang and S.-K. Jen, "Clustering-based I-vector formulation for speaker recognition," Interspeech 2014.
- [11] H. Jing, T.-Y. Hu, H.-S. Lee, W.-C. Chen, C.-C. Lee, **Y. Tsao** and H.-M. Wang, "Ensemble of machine learning algorithms for cognitive and physical speaker load detection," Interspeech 2014.
- [12] P. Lin, F. Chen, S.-S. Wang, **Y. Tsao**, and Y. H. Lai, "Automatic speech recognition with primarily temporal envelope information," Interspeech 2014.
- [13] X. Lu, **Y. Tsao**, S. Matsuda and C. Hori, "Ensemble modeling of denoising autoencoder for speech spectrum restoration," Interspeech 2014,
- [14] X. Lu, **Y. Tsao**, S. Matsuda, C. Hori, "Sparse representation based on a bag of spectral exemplars for acoustic event detection," ICASSP 2014.
- [15] H.-t. Fan, J.-w. Hung, X. Lu, S.-S. Wang, **Y. Tsao**, "Speech enhancement using segmental nonnegative matrix factorization," ICASSP 2014.
- [16] H.-T. Hwang, **Y. Tsao**, H.-M. Wang, Y.-R. Wang and S.-H. Chen, "Alleviating the over-smoothing problem in GMM-based voice conversion with discriminative training," Interspeech 2013.
- [17] T.-H. Wen, A. Heidel, H.-y. Lee, **Y. Tsao** and L.-S. Lee, "Recurrent neural network based language model personalization by social network crowdsourcing," Interspeech 2013.
- [18] X. Lu, **Y. Tsao**, S. Matsuda and C. Hori, "Speech enhancement based on deep denoising autoencoder," Interspeech 2013.
- [19] B. Li, **Y. Tsao** and K. C. Sim, "An investigation of spectral restoration algorithms for deep neural networks based noise robust speech recognition," Interspeech 2013.
- [20] S.-S. Wang, **Y. Tsao**, J.-W. Hung, "Filtering on the temporal probability sequence in histogram equalization for robust speech recognition," ICASSP 2013.
- [21] Y.-C. Su, **Y. Tsao**, J.-E. Wu, F.-R. Jean, "Speech enhancement using generalized maximum a posteriori spectral amplitude estimator," ICASSP 2013.

### **Assistive listening device**

- [1] Y.-T. Liu, R. Y. Chang, **Y. Tsao**, and Y.-p. Chang, "A new frequency lowering technique for Mandarin-speaking hearing aid users," GlobalSIP 2015.
- [2] Y.-T. Liu, **Y. Tsao**, and R. Y. Chang, "A deep neural network based approach to Mandarin consonant/vowel separation," ICCE 2015.
- [3] Y.-H. Lai, F. Chen, and **Y. Tsao**, "Effect of adaptive envelope compression in simulated electric hearing in reverberation," ISIC 2014.
- [4] Y. H. Lai, F. Chen, and **Y. Tsao**, "An adaptive envelope compression strategy for speech processing in cochlear implants," Interspeech 2014,
- [5] Y.-H. Lai, Y.-C. Su, **Y. Tsao**, S.-T. Young, "Evaluation of generalized maximum a posteriori spectral amplitude (GMAPA) speech enhancement algorithm in hearing aids," ISCE 2013.

### **Machine learning**

- [1] H. Jing, A.-C. Liang, S.-D. Lin, and **Y. Tsao**, "A transfer probabilistic collective factorization model to handle sparse data in collaborative filtering," ICDM 2014 (acceptance rate=9.5%)
- [2] H. Jing, **Y. Tsao**, K.-Y. Chen and H.-M. Wang, "Semantic naive Bayes classifier for document classification," IJCNLP 2013.
- [3] H.-y. Lee, T.-y. Hu, H. Jing, Y.-F. Chang, **Y. Tsao**, Y.-C. Kao and T.-L. Pao, "Ensemble of machine learning and acoustic segment model techniques for speech emotion and autism spectrum disorders recognition," Interspeech 2013.
- [4] H. Jing and **Y. Tsao**, "Sparse maximum entropy deep belief nets," IJCNN 2013.

### **(3) Patents**

- [1] S. Matsuda, S. Nakamura, and **Y. Tsao**, “音響モデルの話者適応装置及びそのためのコンピュータプログラム,” JP patent, 2013/09.
- [2] K. Yao and **Y. Tsao**, “Efficient speech recognition with cluster methods,” US patent publication, 2008/12.
- [3] **Y. Tsao** and Y.-C. Su, “generalized maximum a posteriori spectral amplitude estimator for speech enhancement,” TW patent, 2016/01.
- [4] **Y. Tsao**, S.-H. Fang, Y.-R. Chien, and Y. Shiao, “acoustic echo cancellation method and system using prior knowledge of the acoustic conditions,” US patent, submitted 2014, result pending.
- [5] B. Su, Y.-T. Tsai, **Y. Tsao**, and S.-S. Wang, “System and method for beamforming design against direction-of-arrival mismatch,” US patent, submitted 2016, result pending.

### **TECHNOLOGY TRANSFERS**

- [1] ASUS, “Speech enhancement for distant automatic speech recognition,” signing contract.
- [2] Advanced and Wise (A&W) Technology, “Speech enhancement technologies for mobile devices,” 2015/11.
- [3] iMediPlus Inc., “Bio-acoustic signal enhancement,” 2016/01.