## L2-ARCTIC:

## a non-native English speech corpus

Guanlong Zhao<sup>1</sup>, Sinem Sonsaat<sup>2</sup>, Alif Silpachai<sup>2</sup>, Ivana Lucic<sup>2</sup>, Evgeny Chukharev-Hudilainen<sup>2</sup>, John Levis<sup>2</sup>, and Ricardo Gutierrez-Osuna<sup>1</sup>

Presented by Christopher Liberatore<sup>1</sup>

<sup>1</sup>Department of Computer Science, Texas A&M University, U.S.

<sup>2</sup>Department of English, Iowa State University, U.S.







Disclaimer: this project is not affiliated with the CMU-ARCTIC project

## **Outline**

#### Introduction

- Target tasks
  - Voice conversion (VC)
  - Accent conversion (AC)
  - Mispronunciation detection (MPD)
- Motivation

#### **Corpus curation**

- Design philosophy
- Data collection
- Data annotation

#### **Corpus statistics**

#### **Usage examples**

- Accent conversion
- MPD based on GOP

#### **Conclusion**

# **Target tasks**

### Voice conversion for non-native speakers

Change speaker identity

#### **Accent conversion**

Change speaker accent

## Mispronunciation detection

Detect segmental errors in non-native speech

## **Motivation**

- Past voice conversion corpora focus on native speakers
  - CMU ARCTIC (Kominek & Black, 2004)
  - Voice Conversion Challenge dataset (Toda et al., 2016)
  - VCTK (Veaux et al., 2017)
- Limited non-native English resources
  - Noisy and limited data per speaker: Speech Accent Archive (Weinberger) and International Dialects of English Archive (Meier)
  - Restricted access: The Wildcat (Engen et al, 2010),
    LDC2007S08 (Lander), and NUFAESD (Bent & Bradlow, 2003)
- Limited open source resources for MPD
  - Restricted access: CU-CHLOE (Li et al., 2017) and College Learners' Spoken English Corpus (Yang & Wei, 2015)
  - Limited accents: ISLE Speech Corpus (Menzel et al., 2000) and SingaKids-Mandarin (Chen et al., 2016)

# Design philosophy

#### Multi-Dialects

- Indian
- Korean
- Mandarin
- Spanish
- Arabic
- And more...

### Enough data from each speaker

- Phoneme inventory coverage
- Pronunciation error elicitation

#### Annotations

Clear and easy to process

## **Data collection**

### **Participants**

- First release (Apr. 2018): ten speakers from five dialects,
  one male and one female per dialect
- Second release (Sept. 2018): ten more speakers, two for each dialect
- Medium to high English proficiency

### Recording

- Each speaker read 1132 sentences from CMU ARCTIC
- Recorded at ISU in a quite room with a linguist's guidance

### **Post-processing**

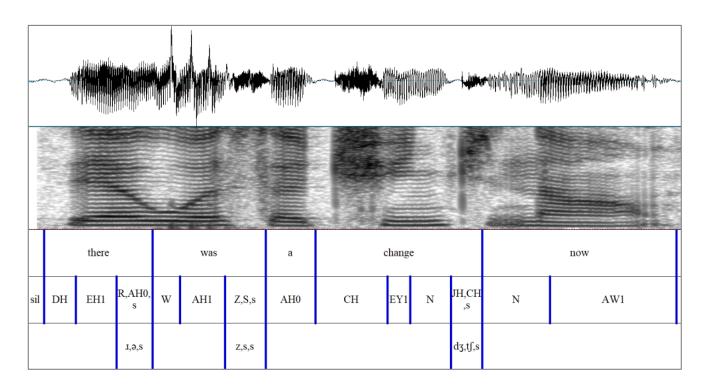
- Removed repetitions and false starts
- Carefully remove the leading and trailing silence and nonspeech sounds

## **Annotations**

## Orthographic

## **Forced-alignment**

### **Manual annotations**



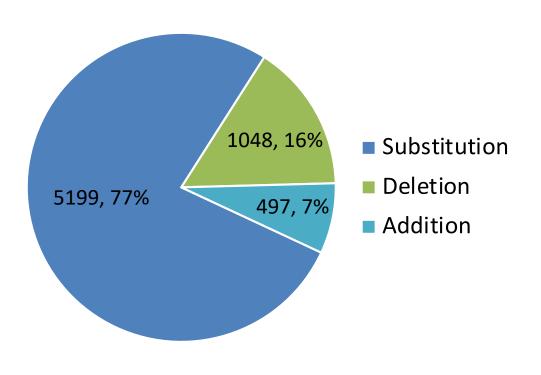
# Corpus statistics: overview

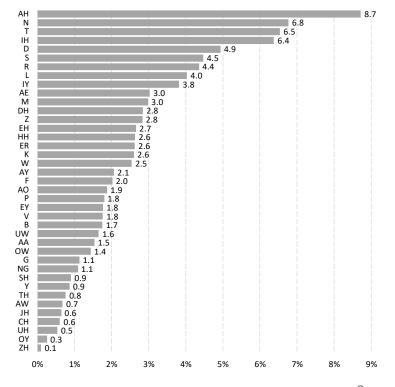
### Speech data (first release)

- 11,026 utterances or 11.2 hours of speech
- Around nine words per sentence (~3.7s)

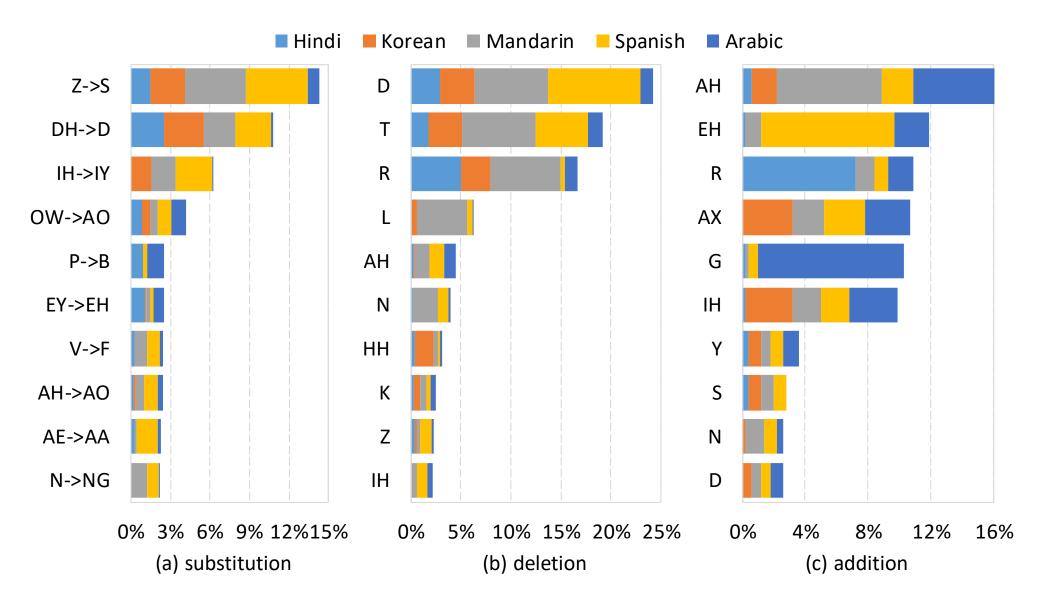
### Manual annotation (first release)

Annotated 1500 sentences (150 per speaker)





# Corpus statistics: annotations (1)



# Corpus statistics: annotations (2)

### High frequency errors

L1	Substitutions	Deletions	Additions
Hindi	DH $\rightarrow$ D, Z $\rightarrow$ S, W $\rightarrow$ V EY $\rightarrow$ EH, TH $\rightarrow$ T	R, D, T ER, HH	R, AH, S, Y AA
Korean	DH $\rightarrow$ D, Z $\rightarrow$ S, IH $\rightarrow$ IY OW $\rightarrow$ AO, EH $\rightarrow$ AE	D, T, R HH, K	AX, IH, AH, S Y
Mandarin	$Z \rightarrow S$ , DH $\rightarrow$ D, IH $\rightarrow$ IY N $\rightarrow$ NG, V $\rightarrow$ F	D, T, R L, N	AH, AX, IH N, R
Spanish	$Z \rightarrow S$ , $IH \rightarrow IY$ , $DH \rightarrow D$ $AE \rightarrow AA$ , $AH \rightarrow AO$	D, T, AH Z, IH	EH, AX, AH IH, IY
Arabic	$P \rightarrow B$ , $OW \rightarrow AO R \rightarrow ERR$ , $DH \rightarrow Z$ , $Z \rightarrow S$	T, R, D AH, IH	G, AH, IH AX, EH

# Usage example: accent conversion

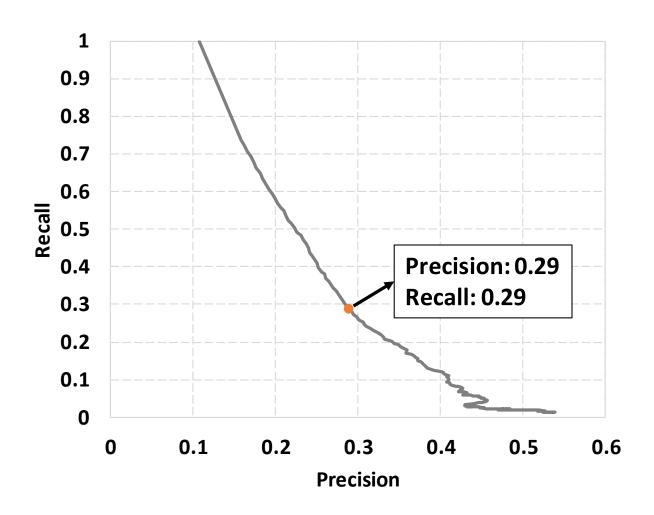
- Published in Accent Conversion Using Phonetic
  Posteriorgrams (Zhao et al., ICASSP'18)
- Used data from speakers in this corpus
- Samples:

L2 speaker	L1 reference	L2 speech	Accent conversion
ABA			
HKK			
TNI			

# Usage example: MPD (1)

- Provide a baseline for MPD on L2-ARCTIC
- Based on a classic Goodness of Pronunciation (GOP) measurement
- Used phone-independent thresholding
- Used 206 utts to determine the search range of the threshold
- Tested on 1293 sentences
  - 41,353 phone samples
  - 4,415 (10%) were tagged as substitution errors

# Usage example: MPD (2)



## Conclusion

#### **Current status**

Released XX speakers

#### **Future work**

- Release more speakers, Vietnamese in progress
- Cross-annotator analysis

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#### Links

- AC samples: <a href="http://people.tamu.edu/~guanlong.zhao/icassp18\_de\_mo.html">http://people.tamu.edu/~guanlong.zhao/icassp18\_de\_mo.html</a>
- Corpus: <a href="https://psi.engr.tamu.edu/l2-arctic-corpus/">https://psi.engr.tamu.edu/l2-arctic-corpus/</a>

# Thanks Q & A