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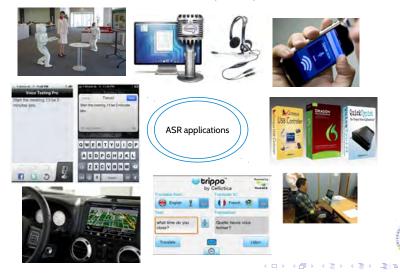


Research on Speech Technology

- Speech synthesis
- Speech recognition
 - Speaker recognition/verification
 - Keyword spotting
- Multimodal interaction (e.g, speech + image)
- Speech to speech



Automatic Speech Recognition (ASR)





Introduction

Current situation for languages in Malaysia

Languages in Malaysia



- Official language: Malay
- Second language: English



-Introduction

Current situation for languages in Malaysia

Languages in Malaysia

Living languages Total: 138

Population: 30 million

- Official language: Malay
- Second language: English

Lewis, Simons, and Fennig, Ethnologue : Languages of the world, Seventh Edition, 2014



-Introduction

Current situation for languages in Malaysia

Languages in Malaysia



Living languages Total: 138

Endangered languages In Trouble - 101 Dying - 15

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-Introduction

Current situation for languages in Malaysia

Languages in Malaysia



- Population: 30 million
- Official language: Malay
- Second language: English

Living languages Total: 138

Endangered languages

In Trouble - 101 Dying - 15

Extinct languages

Total: 2

Lewis, Simons, and Fennig, *Ethnologue : Languages of the world, Seventh Edition*, 2014



Introduction

Current situation for languages in Malaysia

How can we help to preserve or maintain languages?



Language documentation:

- Speech in native language
- Problem: Transcribing speech manually is a tedious task
- Automatic speech recognition system can speed up the process

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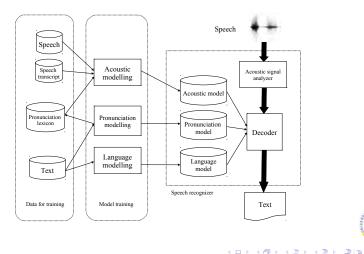
Similar projects: BULB, Aikuma Local RG: Sarawak Language Technology (SaLT), Unimas



-Introduction

Challenges in building ASR for under-resourced languages

Automatic speech recognition system (ASR)

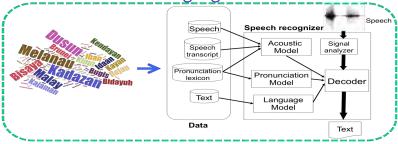




-Introduction

Challenges in building ASR for under-resourced languages

ASR for under-resourced languages



Challenges in dealing with under-resourced languages:

- Poor linguistic knowledge
- Unstable orthography
- Low speaker diversity in available speech databases
- Low amount of available data
- Low ASR performance



- Introduction

Recent advances in ASR for under-resourced languages

Scientific methods in ASR for under-resourced languages

- Bootstrapping pronunciation dictionary ([Maskey, Black, and Tomokiyo, 2004], [Juan and Besacier, 2013])
- ▶ Merging acoustic models ([Tan, Besacier, and Lecouteux, 2014], [Juan et al., 2015])
- Cross-lingual and multilingual acoustic models ([Lu, Ghoshal, and Renals, 2014], [Imseng et al., 2014], [Juan et al., 2015])



ICT for Preserving Indigenous Languages Iban ASR: From collecting data to developing system Iban data collection

Iban data - collected for PhD study



Iban Speech Transcription Workshop 2013

Sarah F. S. Juan 17 - 19 July 2013







Speech data:

- 8 hours of news data
- Collaborative workshop for collecting speech transcripts
 - Hire 8 native transcribers
 - Use Transcriber software [Barras et al., 2000]



LIban data collection

Speech transcripts

ibf_002_003 iya madah ka pengawa tuk deka berengkah dikereja enda lama agi ibf_002_004 sebengkah kompeni minyak ke nyulut royal dutch shell deka begempung enggau petrolium nasional berhad petronas leboh ti bejalai ke dua bengkah projek ngali minyak ba kandang tasik sarawak enggau sabah

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ICT for Preserving Indigenous Languages Iban ASR: From collecting data to developing system Iban data collection

Iban data - collected for PhD study

Data for creating language model and pronunciation dictionary:

- Online news articles
- Obtain 7 thousand articles from 2009-2012
- 2 million words

projek prodZeKK tanah tanah pelajar p @ l a dZ a r bien bn siti sitiKK tuai tuwai anak aneaKK kandang k a n d e a NG penerang p@n@raNG tadi tadiKK pesisir p@sisi@r taja tadZ@KK sepuluh s @ p u l u @ h ketuai k @ t u w ai iban iban

Figure: Iban pronunciation dictionary for ASR



ICT for Preserving Indigenous Languages Lan ASR: From collecting data to developing system Lan corpora for ASR

Iban corpora for ASR

- Speech: 7 hours for training acoustic models, 1 hour for system evaluation
- Language model: 2 million words
- Pronunciation dictionary: 36 thousand pronunciations
- Open Source Toolkits for development: Kaldi¹, SRILM², Phonetisaurus³

²http://www.speech.sri.com/projects/srilm/

 3 https://github.com/AdolfVonKleist/Phonetisaurus $\rightarrow 4 \textcircled{B} \rightarrow 4 \textcircled{E} \rightarrow 4 \textcircled{E} \rightarrow 4 \textcircled{E}$



¹http://kaldi.sourceforge.net/

ICT for Preserving Indigenous Languages Lan ASR: From collecting data to developing system Lan ASR system evaluation

Iban ASR system evaluation

Tested on Iban ASR

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ICT for Preserving Indigenous Languages Lan ASR: From collecting data to developing system Lan ASR system evaluation

Iban ASR system evaluation

Tested on Iban ASR

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Play file: ibm_005_171



ICT for Preserving Indigenous Languages Lan ASR: From collecting data to developing system Lan ASR system evaluation

Iban ASR system evaluation

Summary of Iban ASR results

System	Accuracy (%)
Monolingual	81.25
Cross-lingual	84.85

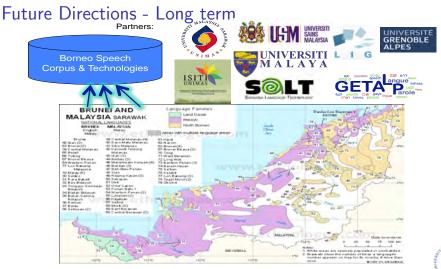
Table: Evaluation on 1 hour data (473 sentences)

- ▶ More information in conference paper [Juan et al., 2015]
- ASR accuracy is still quite low
- Domain-specific system



-Future Directions

Long term goal





Current research work

Ongoing projects

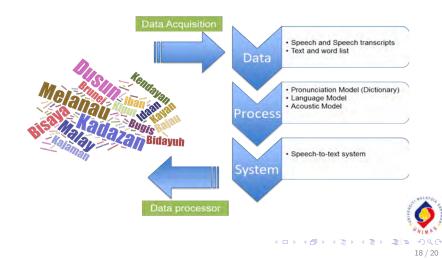
Target language	Project
Melanau, Iban	Corpus building for Multilingual ASR
Iban, Kelabit	ASR prototypes and for mobile devices
Melanau	Pronunciation dictionary for ASR
Iban	Language modelling for low-resource language



ICT for Preserving Indigenous Languages — Future Directions

Current research work

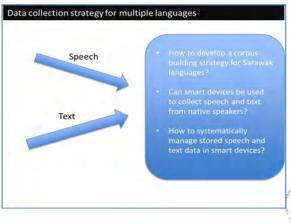
Corpus building for Multilingual ASR



Current research work

Corpus building for Multilingual ASR





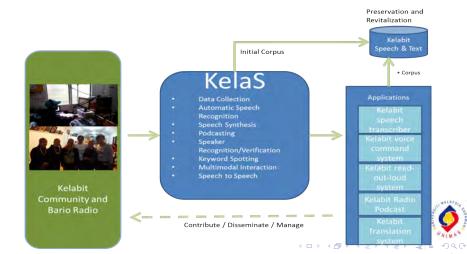


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-Future Directions

Current research work

KelaS: Kelabit Speech Project



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References I

Barras, C. et al. (2000). "Transcriber: development and use of a tool for assisting speech corpora production". In: Proceedings of Speech Communication special issue on Speech Annotation and Corpus Tools. Vol. 33. available at : trans.sourceforge.net/en/publi.php. Imseng, David et al. (2014). "Using out-of-language data to improve under-resourced speech recognizer". In: Speech Communication 56.0, pp. 142-151. Juan, Sarah Samson and Laurent Besacier (2013). "Fast Bootstrapping of Grapheme to Phoneme System for Under-resourced Languages - Application to the Iban Language". In: Proceedings of 4th Workshop on South and Southeast Asian Natural Language Processing 2013. Nagoya, Japan.

References II

Juan, Sarah Samson et al. (2015a). "Merging of Native and Non-native Speech for Low-resource Accented ASR". In: ed. by Klára Vicsi Adrian-Horia Dediu Carlos Martin-Vide. Springer International Publishing. Chap. Statistical Language and Speech Processing, pp. 255–266. Juan, Sarah Samson et al. (2015b). "Using Resources from a Closely-related Language to Develop ASR for a Very Under-resourced Language: A Case Study for Iban". In: *Proceedings of INTERSPEECH*. To appear. Dresden, Germany. Lewis, M. Paul, Gary F. Simons, and Charles D. Fennig (2014). Ethnologue : Languages of the world, Seventh Edition. SIL International. URL: http://www.ethnologue.com (visited on 2013).

References III

Lu, Liang, Arnab Ghoshal, and Steve Renals (2014). "Cross-lingual Subspace Gaussian Mixture Models for Low-resource Speech Recognition". In: IEEE/ACM Transactions on Audio, Speech and Language Processing. Vol. 22, pp. 17-27. Maskey, Sameer R., Alan W Black, and Laura M. Tomokiyo (2004). "Bootstrapping Phonetic Lexicons for Language". In: Proceedings of INTERSPEECH, pp. 69–72. Tan, Tien-Ping, Laurent Besacier, and Benjamin Lecouteux (2014). "Acoustic model Merging using Acoustic Models from Multilingual Speakers for Automatic Speech Recognition". In: Proceedings of International Conference on Asian Language Processing (IALP).