# Toward Univeral Network-based Speech Translation

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# **Outline**

- Technology Review
- U-STAR Consortium
  - Brief History
  - Major Activities
- U-STAR Speech Translation Service
  - Service architecture
  - Service connection protocol
  - Resource and engine development
- Evaluation and Issues
  - Lab and field-testing evaluations
  - Major issues
- Conclusion





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# **Technology Review<sup>1</sup>**

# **Confirmation of Feasibility**

 ITU Telecom World 1983
 NEC Corporation performed a demo as a concept exhibit



# **Extension of Technology**

- **1993** ATR (Japan), CMU (USA) and Siemens jointly researched
- **1999 C-STAR** The Consortium for Speech Translation Advanced Research, aiming at a travel planning system using 6 languages (En, Ja, Ge, Ko, It, Fr)





# **Technology Review<sup>1</sup>**

# **Attempts at Practical Systems**

- 2000 NESPOLE! Negotiating through Spoken Language in E-Commerce, funded by NSF
- 2001 IBM Multilingual Automatic Speech-to-Speech Translator (MASTOR) project funded by DARPA
- 2004 TC-STAR Technology and Corpora for Speech -to-Speech Translation of European English, European Spanish, and Mandarin Chinese
- 2006 GALE Global Autonomous Language Exploitation, funded by DARPA for translation Arabic and Chinese speech and text to English
- 2009 TransTac Spoken Language Communication and Translation Systems for Tactical Use, funded by DARPA for military-used translation devices





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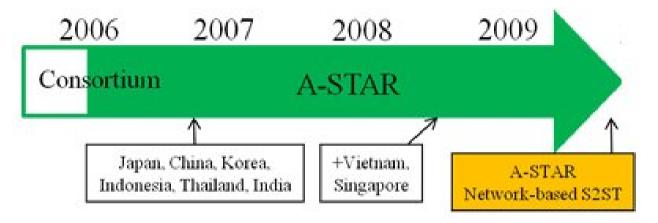
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2006 : A-STAR Consortium

Asian Speech Translation Advanced Research



- Basic Travel Expression Corpus (BTEC) translated to 8 Asian languages by member countries
- Speech Translation Marked-up Language (STML) proposed as a standard connection protocol in APT/ASTAP





### 2009: A-STAR S2ST Live Demo

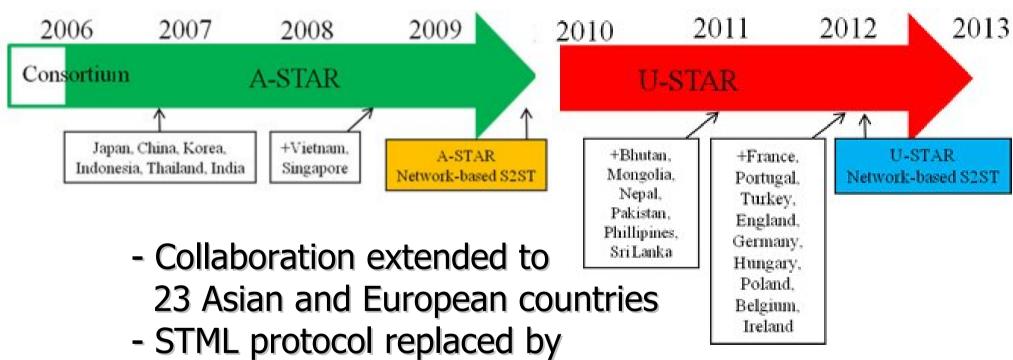
- Network-based Multilingual S2ST
- 8 Asian languages and English
- Peer-to-peer and Multi-party clients
- Portable devices (UMPC)







2010: U-STAR Consortium
 Universal Speech Translation Advanced Research



- STML protocol replaced by

Multimedia Content Marked-up Language (MCML),
registered as an ITU-T recommendation standard





### 2012: U-STAR S2ST Public Service

- Network-based Multilingual S2ST in the travel and sport domain
- 23 Asian and European languages supported
- VoiceTra4U-M, an iPhone App available freely
  - on the AppStore
- Service launched in Jun 2012, before the openning of London Olympic Games







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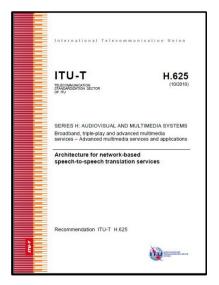




# **U-STAR S2ST Service Protocol**<sup>3</sup>



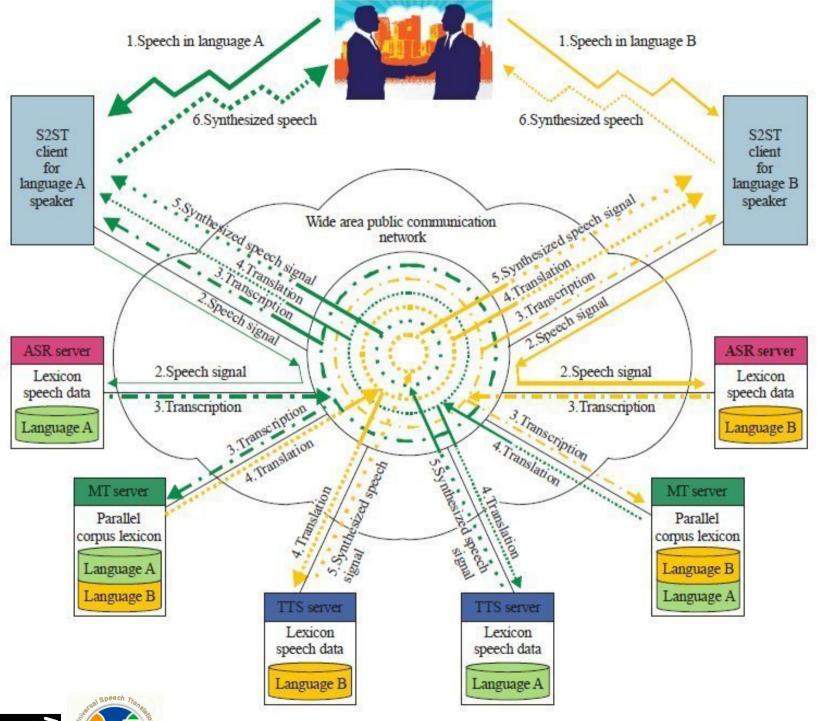
 ITU-T F.745 – Functional requirements for network-based speech-to-speech translation services



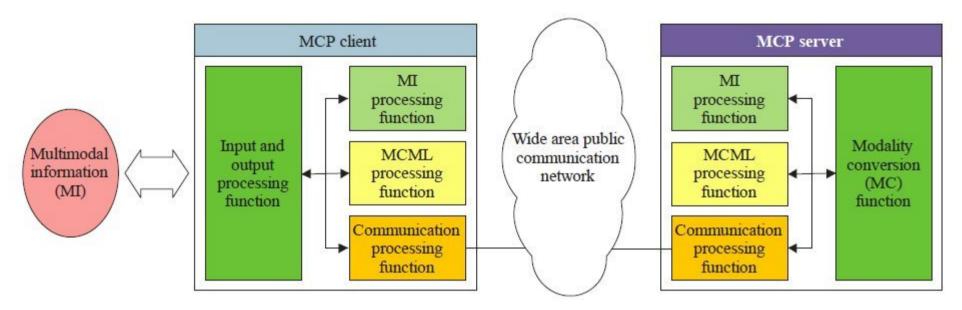
 ITU-T H.625 – Architecture for networkbased speech-to-speech translation services







# **U-STAR S2ST Service Protocol**<sup>3</sup>



# **Modality Conversion Protocol (MCP)**

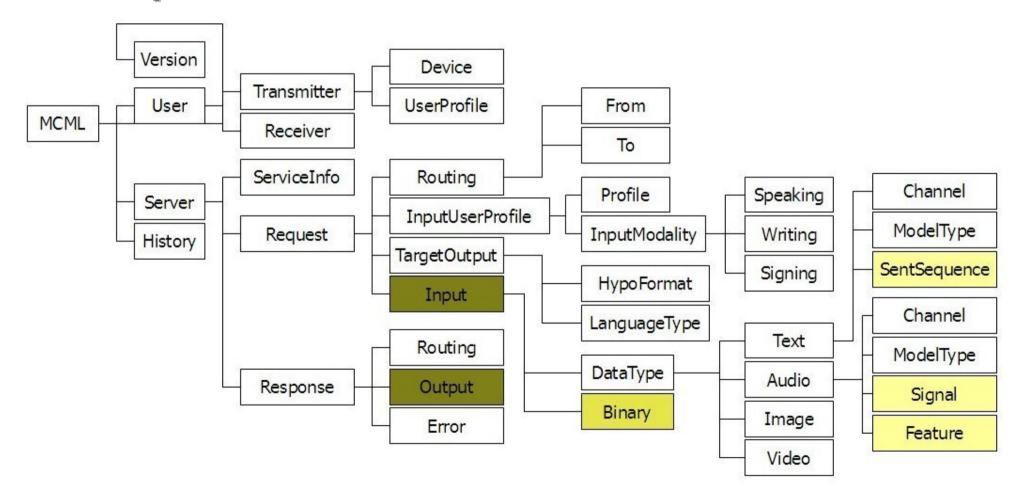
- Multimodal Information (MI) transferred to/from a MCP client, i.e. a S2ST client
- MCP client communicates with MCP server using Modality Conversion Marked-up Language (MCML)
- MCP server includes ASR, MT, and TTS servers





# **U-STAR S2ST Service Protocol**<sup>3</sup>

### A part of MCML structure







# Common Language Resources

- Basic Travel Expression Corpus (BTEC) has been used to translate to member languages since A-STAR
- To extend the service for users during London Olypic Games, an Olympic expression corpus by Harbin Institute of Technology (HIT) has been acquired and distributed to translate
- A Named Entity (NE) list of words related to Olympic expressions has also been collected from member countries
- Parallel corpora have been NE tagged for class-based language modeling



# Thai Language Resources<sup>4</sup>

Corpus	Purpose	Characteristic
Read speech	Acoustic model	48 speakers
(LOTUS PB)	initialization	15,600 utterances
Multi-conditioned	Acoustic model	50 hours, 48 speakers
read speech	re-estimation	128,768 utterances
(NECTEC-ATR)		
Telephone speech	Acoustic model	20 hours, 162 speakers
(LOTUS-CELL)	adaptation	35,851 utterances
Travel-domain	Language	87,355 sentences
text (BTEC)	modeling	14,685 vocabulary
Sport-domain	Language	56,460 sentences
text (HIT)	modeling	9,576 vocabulary





# NE Category⁴

No.	Category	Example
1	SPORT	archery, badminton, basketball
2	PERSON	Chai, John, Gihan, Eiichiro
3	TRANSPORT	bus, bicycle, airplane, car
4	COUNTRY	Australia, Belgium, Brazil, India
5	CURRENCY	Dong, US Dollar, Manat, Baht

# Examples of Engines<sup>5</sup>

Language	ASR	MT	TTS
English (En)	HMnet (SSS)		Concatenative
Hindi (Hi)		SMT (Cleopatra)	HMM
Indonesian (Id)	HMnet (SSS)	SMT (Moses)	НММ
Japanese (Ja)	HMnet (SSS)	SMT (Cleopatra)	Concatenative
Korean (Ko)	FST	RBMT (Parser)	HMM
Malay (Ms)	HMM	RBMT (Piramid) HMM	
Thai (Th)	HMM	SMT (Moses)	HMM
Vietnamese (Vi)	HMM	SMT (Moses)	HMM
Chinese (Zh)	HMnet (SSS)	SMT (Cleopatra)	Concatenative





# **U-STAR S2ST Client**

### VoiceTra4U-M iPhone App





- Peer-to-peer communication
- Multi-party chatting
- Available freely on AppStore for worldwide field-testing







# U-STAR S2ST Client

- 23 langauges supported
- 17 languages speech input enabled

Language	Input		Output	
	Speech	Text	Speech	Text
Dutch	✓	✓		✓
Dzongkha		<b>√</b>		✓
English	✓	✓	<b>√</b>	✓
French	✓	✓		✓
German	✓	✓		✓
Hindi	✓	✓	✓	✓
Hungarian	✓	✓	✓	✓
Indonesian	✓	✓	✓	✓
Japanese	✓	✓	✓	✓
Korean	✓	✓	<b>√</b>	✓
Malay	✓	$\checkmark$	<b>✓</b>	✓
Mandarin	✓	$\checkmark$	<b>✓</b>	$\checkmark$
Mongolian		$\checkmark$		$\checkmark$
Nepali		$\checkmark$		$\checkmark$
Polish	✓	✓	<b>✓</b>	✓
Portuguese	✓	✓	<b>✓</b>	✓
Russian	✓	✓		✓
Sinhala		✓		✓
Tagalog		✓		<b>√</b>
Thai	<b>✓</b>	✓	✓	✓
Turkish	<b>✓</b>	✓	<b>√</b>	✓
Urdu		✓	<b>√</b>	✓
Vietnamese	✓	✓	✓	✓





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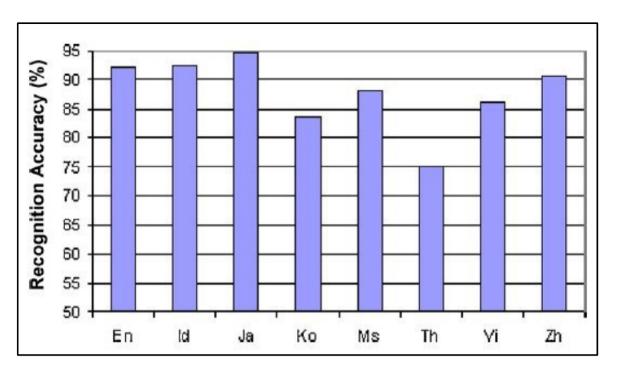
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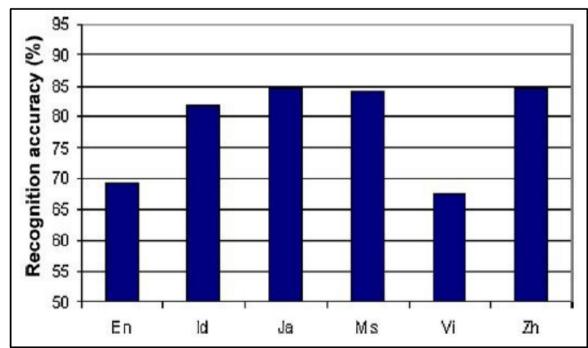




# ASR Performance<sup>5</sup>(2010)

Test set taken from BTEC





Test set including dialog scenarios





# MT Performance (2010)<sup>5</sup>

Pair	ASR Result	Correct Recognition Result
En-Ja	27.8	42.8
Ja-En	38.1	43.0
Ja-Hi	10.9	12.2
Ja-Id	25.1	28.2
Ja-Ko	19.2	23.0
Ja-Ms	33.7	34.9
Ja-Th	32.4	37.7
Ja-Vi	25.1	28.0
Ja-Zh	35.1	41.1

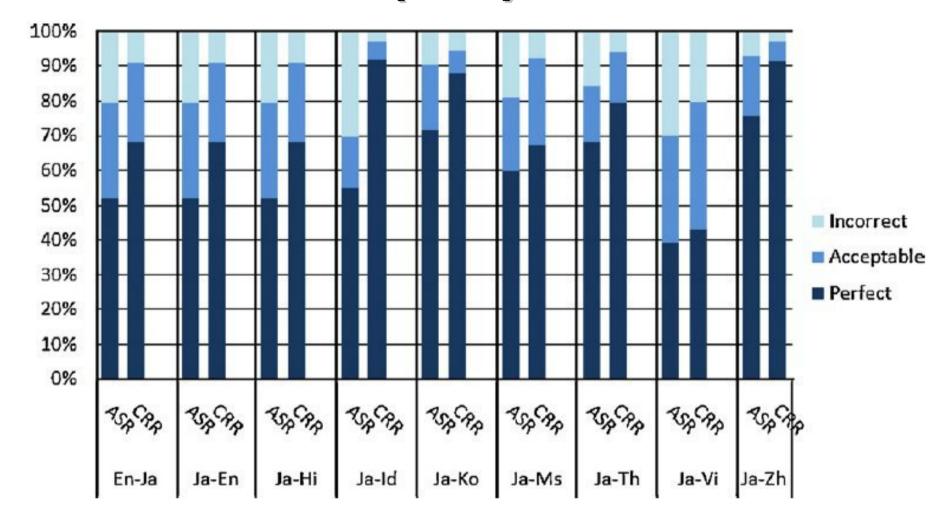
Test set including dialog scenarios

Measured in BLEU score





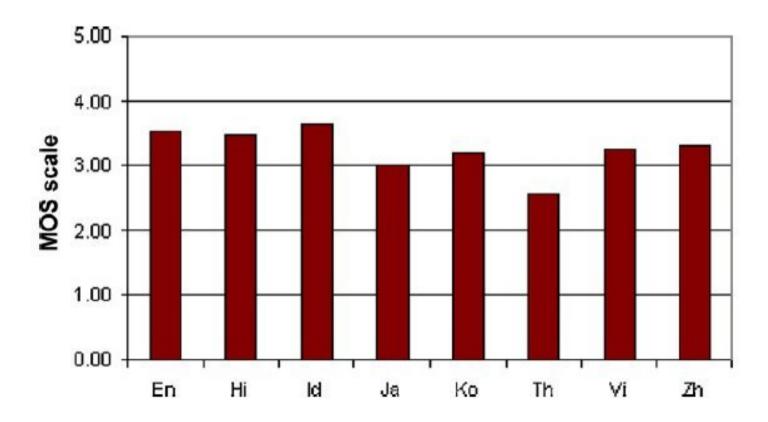
# MT Performance (2010)<sup>5</sup>







# TTS Performance (2010)<sup>5</sup>







# • No. of Downloads (Jul-Oct 2012) — 15,645 in total

Country	Total
Japan	7266
Thailand	5984
United States	1098
Brazil	253
Taiwan	177
Singapore	165
China	154
United Kingdom	76
Australia	56
Russian Federation	45
France	40
Canada	29
Hong Kong	27

Country	Total
Germany	20
Indonesia	18
Poland	16
Malaysia	12
Belgium	11
Israel	11
India	11
Viet Nam	10
Spain	9
Korea	9
Latvia	9
Italy	8
Netherlands	8





### • No. of Transactions (2012) - 26,882 in total

Language	Utterances
Japanese	10333
English	5179
Thai	7104
Chinese	965
English (UK)	833
Korean	496
Hindi	181
French	263
German	1362
Indonesian	122
Polish	22
Hungarian	10
Portuguese	7
Malay	5

# Analysis of Thai ASR Speech Input

- 2,480 utterances during Jul 2012

Useful		Garbage	
Normal	52.6%	Incorrect language used	4.8%
Noisy	23.1%	Silence only	16.4%
Left or right chopped	3.1%		

# Thai Language Model Interpolation

- Using another 1,000 utterances from real services

Interpolation Weight		WER (%)	PP	OOV (%)
BTEC+HIT	1,000 Utt.			
1.0	0.0	51.7	77.5	3.4
0.25	0.75	59.3	13.9	1.4





# **Issues**

# Named-Entities (NE)

- NE words are often language specific
- When there is no direct translation of a given NE word
  - 1) Using a compound or descriptive word
  - 2) Using transliteration
- Compounds occurred e.g. in Thai have often made confusion with common words in class-based language modeling

# Scalability and Extensibility

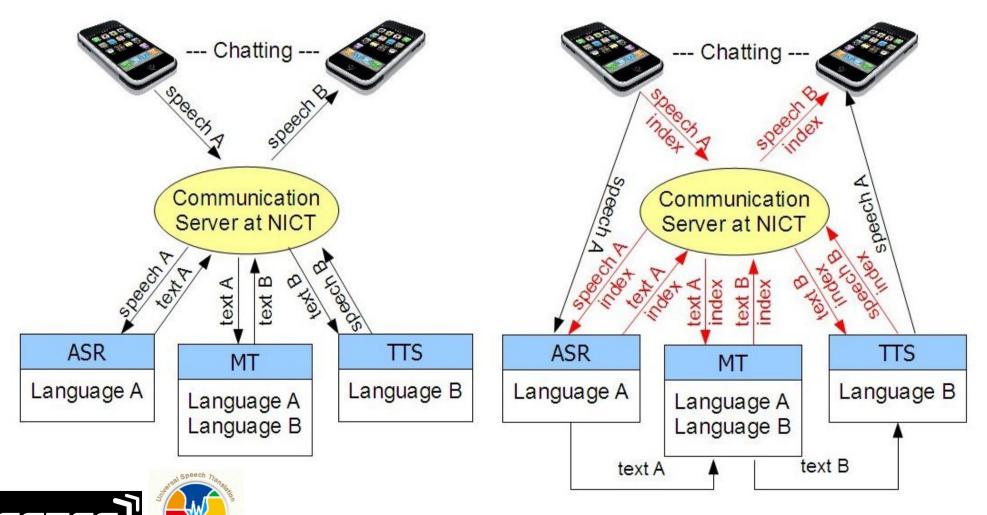
- Service capacity requires continuous maintenance of all language services locating in member countries
- Improving service performance by enlarging service lexicon and training data gathered from real usage
- Extending to new domains and languages





# **Issues**

- Service Latency
  - The condition of network is the key
  - Setting communication mirror servers



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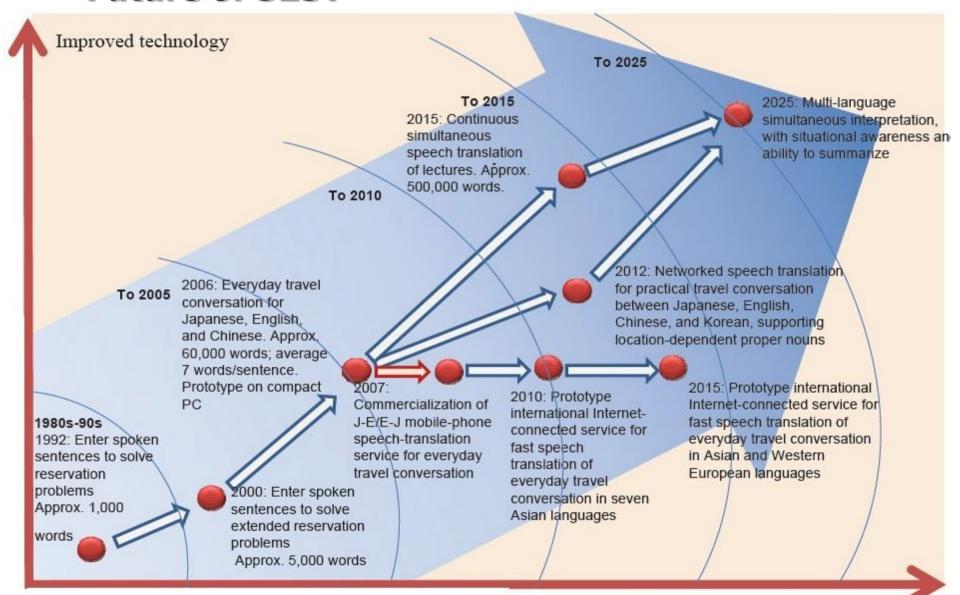
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# **Conclusion**

### Future of S2ST<sup>1</sup>



# **Conclusion**

# Advantages of U-STAR Framework

- U-STAR provides a service infrastructure with the ITU-T recommendation connection standard available for extending to Universal S2ST, where individual language engines are flexible
- Language resources and tools sharing in the network are useful for future research and innovation

### Near Future Direction

- Service improvement in term of accuracy and latency
- Service extension to new member languages





# References

- <sup>1</sup> S. Nakamura, 2009. Overcoming the language barrier with speech translation technology. Science and Technology Trends – Quarterly Review No. 31, Apr 2009, pp. 35-48.
- <sup>2</sup> U-STAR consortium, http://ustar-consortium.com/
- <sup>3</sup> ITU-T standard, http://www.itu-t.int/
- <sup>4</sup> C. Wutiwiwatchai, K. Thangthai, P. Sertsi, 2012. Thai ASR development for network-based speech translation. To be printed in Proc. of O-COCOSDA 2012.
- <sup>5</sup> S. Sakti, M. Paul, A. Finch, S. Sakai, T. T. Vu, N. Kimura, C. Hori, E. Sumita, S. Nakamura, J. Park, C. Wutiwiwatchai, B. Xu, H. Riza, K. Arora, C. M. Luong, H. Li, 2011. Toward translating Asian spoken languages. Computer Speech and Language (2011), doi:10.1016/j.csl.2011.07.001.







