

Advances on Spoken Language Translation in the Quaero Program

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<http://www.quaero.org>



2011 Spoken language translation (SLT) evaluation

- ▶ **Annual project-internal evaluation conducted by DGA**
- ▶ **Goal:**
 - ▷ evaluate market readiness and maturity of the developed technologies
- ▶ **SLT eval builds upon previous year's ASR eval**
 - ▷ ASR Rover output as MT source
- ▶ **Language pairs: German-French in both directions**
- ▶ **Data:**
 - ▷ publicly available + internally collected
- ▶ **Participants:**
 - ▷ KIT, LIMSI, RWTH, SYSTRAN



Outline

- ▶ **Evaluation framework**
- ▶ **Data description**
- ▶ **System descriptions**
 - ▷ **KIT**
 - ▷ **LIMSI**
 - ▷ **RWTH**
 - ▷ **SYSTRAN**
- ▶ **Results**
- ▶ **Summary**



Evaluation framework

- ▶ **Language pairs:**
 - ▷ German-French in both directions
- ▶ **Conditions:**
 - ▷ (manual transcriptions)
 - ▷ automatic transcriptions: ASR Rover, automatically segmented
- ▶ **Evaluation data domain:**
 - ▷ mixture of broadcast news and broadcast conversation
- ▶ **Scoring:**
 - ▷ two references produced by professional translators
 - ▷ BLEU and TER



Data description

- ▶ **Publicly available data**

- ▷ **bilingual and monolingual data from WMT 2010**

ACL 2010 Joint Fifth Workshop On Statistical Machine Translation

- ▶ **Internally collected data (politics-news, UN documents)**

- ▷ `admin.ch`
 - ▷ `project-syndicate.org`
 - ▷ `bookshop.europa.eu`
 - ▷ `presseurop.eu`
 - ▷ `arte.tv`



Statistics for internally collected data

Training data:

	German	French
Documents	16 K	
Running words	5.3M	6.3M
	French	
Documents	250 K	
Running words	70 M	
	German	
Documents	69 K	
Running words	25 M	

Evaluation data:

	German-French	French-German
Documents	7	5
Sentences	971	823
Running words	23K	21K



System description: KIT

► Preprocessing

▷ Training data:

- remove punctuation on source side
- filter noisy data with SVM classifier

▷ Test data:

- smart casing to achieve higher coverage

► In-house phrase-based decoder

▷ phrase extraction: Moses

▷ 4-gram LMs with Kneser-Ney smoothing

▷ parameters optimized for BLEU with MERT



System description: KIT

► State-of-the-art extensions

- ▷ POS-based short-range reordering (Rottmann and Vogel, TMI 2007)
- ▷ POS-based long-range reordering (Niehues and Kolss, WMT 2009)
- ▷ phrase extraction from reordering lattice
- ▷ bilingual language model (Niehues et al., WMT 2011)
 - word-based
 - POS-based (German: RF tagger, French: LIA tagger)



System description: LIMSI

► Preprocessing

▷ Test data:

- remove partially recognized and repeated words

► bilingual n -gram-based decoder *N-code*

(<http://www.limsi.fr/Individu/jmcrego/bindecoder/>)

- ▷ monotone decoding
- ▷ input: reordering lattice computed with FST using POS information
- ▷ 4-gram LMs with Kneser-Ney smoothing
- ▷ parameters optimized for BLEU with MERT



System description: LIMSI

► State-of-the-art extensions

- ▶ German POS-tagging with CRF-based tagger (Lavergne et al., ACL 2010)
- ▶ neural network language model (SOUL) (Le et al., ICASSP 2011)
 - 10-gram history size
 - applied in n -best list rescoring



System description: RWTH

► Preprocessing

▷ Training data:

- remove punctuation on source side
- add period at end of sentence

► In-house phrase-based decoder

- ▷ parameters optimized for BLEU with Downhill-simplex algorithm

► Hierarchical phrase-based decoder *Jane* (Vilar et al., WMT 2010)

(<http://www-i6.informatik.rwth-aachen.de/jane>)

- ▷ parameters optimized for BLEU with MERT

► 4-gram LMs with Kneser-Ney smoothing



System description: RWTH

► State-of-the-art extensions

- ▷ Triplet lexicon model (Hasan et al., EMNLP 2008)
- ▷ Discriminative word lexicon model (Mauser et al., EMNLP 2009)
- ▷ System combination (Leusch et al., WMT 2011)



System description: SYSTRAN

- ▶ **Commercial MT system developed over decades**
- ▶ **Rule-based core engine with large-scale dictionaries**
- ▶ **Progressive integration of state-of-the-art MT techniques, e.g.**
 - ▷ **Statistical post-edition**
 - ▷ **Word sense disambiguation (WSD) models**
 - ▷ **Decision trees for POS disambiguation**
- ▶ **Combination of linguistic and statistical methods**



System description: SYSTRAN

- ▶ **Rule-based translation is performed in 4 steps:**
 - ▷ **Preprocessing**
 - **Segmentation**
 - **Normalization**
 - **Dictionary lookup**
 - ▷ **Analysis**
 - **Morphological analysis**
 - **POS analysis**
 - **Named entity recognition**
 - **Syntactic dependency parsing**
 - ▷ **Transfer**
 - **Application of transfer dictionaries and contextual disambiguation rules**
 - ▷ **Synthesis**
 - **Syntactic rearrangement**
 - **Morphological generation**



2011 Evaluation results

German→French:

System	BLEU [%]	TER [%]
KIT	18.4	70.4
LIMSI	13.4	71.0
RWTH	16.1	69.7
SYSTRAN	10.0	76.7

French→German:

System	BLEU [%]	TER [%]
KIT 2009	16.4	67.5
KIT 2010	17.7	66.1
KIT	18.9	68.0
LIMSI	17.0	68.7
RWTH 2009	12.0	70.1
RWTH 2010	17.3	66.7
RWTH	17.6	65.5
SYSTRAN	16.0	71.5



Summary

- ▶ **Rover from 2010 ASR eval as input for 2011 SLT eval**
- ▶ **German-French in both directions**
- ▶ **Public and internally collected data**
- ▶ **KIT, LIMSI, RWTH**
 - ▷ **statistical systems: phrase-based, hierarchical, n -gram-based**
 - ▷ **state-of-the-art extensions developed in Quaero**
- ▶ **SYSTRAN**
 - ▷ **commercial rule-based engine**
- ▶ **French→German: +2.5% BLEU since 2009**



Thank you for your attention

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