# **Applications**

of Machine Translation

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- Historical Overview
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- Open Source Software
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- Future Aspects

#### Before the Computer:

Mid 1930s: Georges Artsrouni and Petr Troyanskii applied for patents for 'translating machines'

#### Proposing

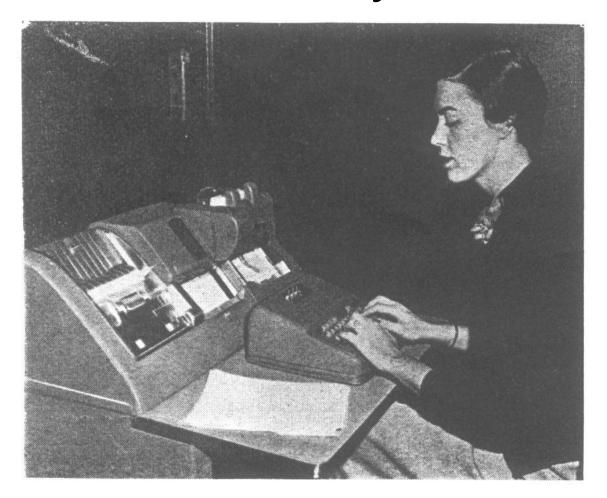
- a method for an automatic bilingual dictionary
- a scheme for coding interlingual grammatical roles (based on Esperanto)

#### The pioneers, 1947-1954

first appearance of 'electronic calculators' research on using computers for translating natural languages

#### **Motivations:**

- wartime successes in code breaking
- developments by Claude Shannon in information theory
- 1954 the first public demonstration (IBM and Georgetown University)



Sentences in Russian are punched into standard cards for feeding into the electronic data processing machine for translation into English

The decade of optimism, 1954-1966 Early systems:

- bilingual dictionaries
- rules for producing correct word order (rules for syntactic ordering were too complex, need for more systematic methods of syntactic analysis)

"breakthroughs", "semantic barriers", no solution

Automatic Language Processing Advisory Committee (ALPAC)

- famous 1966 report: MT slower, less accurate and twice as expensive as human translation
- no need for further investment in MT research

#### After the ALPAC report, 1966-1980

- virtual end to MT research in the United States, Soviet Union
- Research continues in Canada, France Germany

#### SYSTRAN System

- USAF (1970)
- Commission of the European Communities (1976)

#### METEO (Montreal University)

Translation of weather reports

**Motivation:** 

1960s:

English-Russian translation of scientific and technical documents

Mid-1970s:

administrative and commercial demands of multilingual communities and multinational trade (Europe, Canada, Japan)

#### The 1980s:

mainframe systems

- Logos (German-English and English-French)
- Pan American Health Organization (Spanish-English and English-Spanish)
- Metal system (German-English)
- major systems for English-Japanese

- Microcomputers (text-processing) -> cheaper MT systems
- Research -> advanced methods (indirect translation, interlingual)
- Projects: GETA-Ariane (Grenoble), SUSY (Saarbrücken), Mu (Kyoto), DLT (Utrecht), Rosetta (Eindhoven), Carnegie-Mellon University (Pittsburgh), Eurotra (EC supported), Japanese CICC

#### Early 1990s:

- IBM Group: Candide (statistical methods)
- Japanese Groups (corpora, example/based)
- Start of speech translation (speech recognition, synthesis and translation)
- Projects: ATR (Nara, Japan), JANUS (ATR, Carnegie-Mellon University, University of Karlsruhe), Verbmobil (Germany)

#### Changing focus:

- "pure" research -> practical applications
- translator workstations for professional translators
- translating components in multilingual information systems

#### Late 1990s and early 2000s:

- software localisation
- growth in sales of MT software for PC
- MT from online networked services (e.g. AltaVista)
- automatic translation for direct Internet applications (electronic mail, Web pages, etc.), fast, less quality

- Founded in 1968
- 1970: US Air Force (Russian-English)
- 1974/75: NASA (joint Apollo-Sojus project)
- 1975: Prototype for European Commission
- 1978: Xerox (multilingual products)
- 1981: Japanese-English
- 1989: Customer Specific Dictionaries

- 1992: "C" conversion project (PC)
- 1996: US National Air Intelligence (Eastern European languages)
- 1997: embedded MT software (Ford), Babelfish
- 1998: Online Gaming (EA)
- 2000: OracleMobile (wireless potal)
- Yahoo!, Altavista Babelfish, Google translate

#### **Daimler-Chrysler:**

1998 merger of Daimler-Benz AG with the Chrysler Corporation>more than 372,500 people in 37 countries>Communication Challenge!

Professional Translation for Human Resource Materials, etc.

**BUT:** 

MT-System for informal Communication (emails,...)

#### Features:

- German-English bidirectional language pairs
- No installation of client software
- Seamless integration with DC's IT environment
- Low performance costs
- No maintenance requirements
- Ease of use and access

#### Implementation:

- Intranet Installation used by 25,000 employees for translation of Web pages, emails and corporate documents
- Browser-based interface
- Central SYSTRAN intranet server

Autodesk: Multilingual Customer Support Implementation:

SYSTRAN hosts translation servers, develops the specialized lexicons, glossaries, and graphs for the highly technical Autodesk vocabulary

System is expected to produce usable quality with no postediting

Cinématique Gaumont: French film library

For universal access SYSTRAN provides a translation solution for researchers to access the database in English

#### Today:

XML-based engine

#### 3 dictionaries:

- User dictionary
- Translation Memories (strength of human translation)
- Normalization dictionary

- A beam search decoder for phrase-based models
  - works with various phrase-based models
  - beam search algorithm
  - time complexity roughly linear with input length
  - good quality takes about 1 second per sentence
- Very good performance in DARPA/NIST Evaluation
- Freely available for researchers http://www.isi.edu/licensed-sw/pharaoh/

#### Components needed:

- Decoder code
- Parallel Corpus (e.g. Europarl: from the proceedings of the European Parliament)
- Training Program for language model
- Additional Tools (word lattices, n-best list,...)
- Training System to generate translation models

#### Running the decoder:

% echo 'das ist ein kleines haus' | pharaoh -f pharaoh.ini > out Pharaoh v1.2.9, written by Philipp Koehn a beam search decoder for phrase-based statistical machine translation models

- (c) 2002-2003 University of Southern California
- (c) 2004 Massachusetts Institute of Technology
- (c) 2005 University of Edinburgh, Scotland

loading language model from europarl.srilm

loading phrase translation table from phrase-table, stored 21, pruned 0, kept 21

loaded data structures in 2 seconds

reading input sentences

translating 1 sentences.translated 1 sentences in 0 seconds

[3mm] % cat out

this is a small house

#### Phrase Translation Table

```
der ||| the ||| 0.3
das ||| the ||| 0.4
das ||| it ||| 0.1
das ||| this ||| 0.1
die ||| the ||| 0.3
ist ||| is ||| 1.0
ist ||| 's ||| 1.0
das ist ||| it is ||| 0.2
das ist ||| this is ||| 0.8
es ist ||| it is ||| 0.8
es ist ||| this is ||| 0.2
ein ||| a ||| 1.0
ein ||| an ||| 1.0
klein ||| small ||| 0.8
klein || little || 0.8
kleines ||| small ||| 0.2
kleines || little || 0.2
```

#### Trace

```
% echo 'das ist ein kleines haus' | pharaoh -f pharaoh.ini -t [...]
this is |0.014086|0|1| a |0.188447|2|2| small |0.000706353|3|3|
house |1.46468e-07|4|4|
```

- Trace for each applied phrase translation:
  - output phrase (there is)
  - cost incurred by this phrase (0.014086)
  - coverage of foreign words (0-1)

#### Reordering

% echo 'ein kleines haus ist das' | pharaoh -f pharaoh.ini -t -d 0.5

[...]

this |0.000632805|4|4| is |0.13853|3|3| a |0.0255035|0|0|

small |0.000706353|1|1| house |1.46468e-07|2|2|

 First output phrase this is translation of the 4th word

#### Hypothesis Accounting

% echo 'das ist ein kleins haus' | pharaoh -f pharaoh.ini -v 2 [...]

HYP: 114 added, 284 discarded below threshold, 0 pruned, 58 merged.

BEST: this is a small house -28.9234

- Statistics over how many hypothesis were generated
  - 114 hypotheses were added to hypothesis stacks
  - 284 hypotheses were discarded because they were too bad
  - 0 hypotheses were pruned, because a stack got too big
  - 58 hypotheses were merged due to recombination
- Probability of the best translation: exp(-28.9234)

#### Many more Parameters to customize:

- Translation Options
- Future Cost Estimation
- Hypothesis Expansion
- Beam Size (trade-off between speed and quality)
- Limits on reordering
- Word Lattice Generation
- N-best list

## Moses

Very similar to Pharaoh

#### **Advanced Features:**

- Lexicalized Reordering Models
- Binary Phrase Tables with On-demand Loading
- Efficient Language Model Handling
- Conversion to binary format
- Binary language model format
- Quantized language model format
- XML Markup
- Parameters

## Developments

 Google Machine Translation Systems (Google Research Lab)

underlying principle:

system is learning from existing human translations, large corpus of texts (Rosetta Stone approach)

# Developments

Original (Arabic) البیت الاینس بزکد رجرد شریط مسجل جدید لین لا



#### Existing translation

Alpine white new presence tape registered for coffee confirms Laden

#### Google Research translation

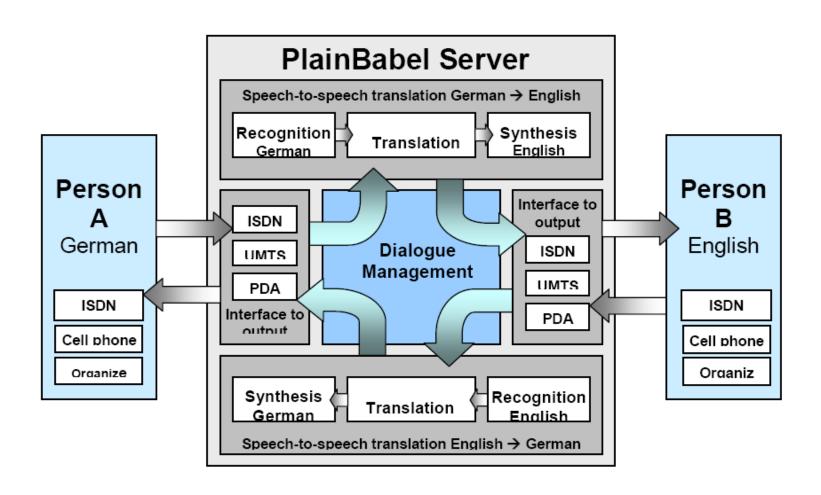
The White House Confirmed the Existence of a New Bin Laden Tape

#### **Speech-to-Speech Translation**

SpeechTrans<sup>™</sup>:
 integrated Automatic Speech Recognition
 (ASR) and Text-to-Speech (TTS) with
 Machine Translation
 real-time dynamic speech-to-speech
 machine translation (computers, wearable
 machines, telephony servers)

# PlainBabel – Simultanseous Machine Translation

dialogue driven speech-to-speech translation system that allows for a bilingual natural dialogue between two parties that don't speak each others language. The system can be used with different types of output devices from an ISDN telephone to a 3G mobile phone.



#### Information Retrieval

TextFinder:

Linguistic enhanced information retrieval with query translation, thematic search, and name/event retrieval. Included morphology enhanced text indexing and searching.

#### **Media-mining**

transcribed text.

Media Sphere "Telephony/TV":
 Real-Time telephony and video broadcast capture, transcription, indexing, searching and playback. Includes Machine Translation engine for translation of

#### **Automatic Video Subtitling**

Example: original German broadcast with English subtitles that were created by first running Speech Recognition to produce the German transcript and then Machine Translation to create English text.

## **Future**

#### Trends:

- Highly integrated translation systems
- hybrid statistical-linguistic translation
- multi-engine translation systems
- development of new statistical techniques
- Portable speech-to-speech MT systems

## LINKS

http://ourworld.compuserve.com/homepages/WJHutchins/

http://www.systransoft.com/

http://www.isi.edu/publications/licensed-sw/pharaoh/

http://www.statmt.org/moses/

http://www.apptek.com/

http://www.iccs.inf.ed.ac.uk/~pkoehn/publications/tutorial2006.pdf

http://www.isi.edu/natural-language/publications.html

http://www.lsi.upc.edu/~jgimenez/MT/

http://www.geocities.com/langtecheval/

http://www.ikp.uni-bonn.de/dt/lehre/materialien/maschueb/

http://www.amtaweb.org/

http://www.eamt.org/

http://www.aamt.info/