## **Excursion: Machine Translation**

Andreas Maletti

April 24, 2007

# Natural Language Processing

### **Subfields**

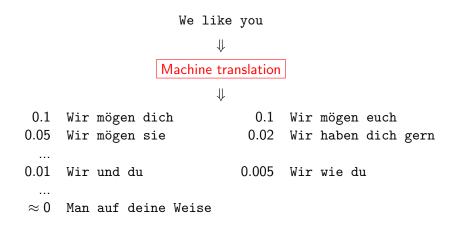
- Speech recognition and synthesis
- Machine translation
- Language modelling
- Text summarization
- **.**..

### Machine Translation

- ► Rule-based (e.g. SysTran)
- ► Statistical (e.g. GOOGLE TRANSLATOR)

# Statistical Machine Translation System

### Overview



# Implicit vs. explicit knowledge

## Implicit knowledge

- model restrictions; hard-wired information
- task-specific; difficult to adapt
- supplied by programmer

## Explicit knowledge

- model parameters; inputs
- task-specific; easy to change
- supplied by programmer or training

# Implicit vs. explicit knowledge

## Implicit knowledge

- model restrictions; hard-wired information
- task-specific; difficult to adapt
- supplied by programmer

## Explicit knowledge

- ► model parameters; inputs
- ► task-specific; easy to change
- supplied by programmer or training

⇒ Framework approach

# A closer look — string-based (e.g. CARMEL)

#### Overview

$$\begin{array}{c} \mathsf{Input} \\ \mathsf{Text} \end{array} \Rightarrow \begin{array}{c} \mathsf{Translation} \\ \mathsf{(e.g.\ FST)} \end{array} \Rightarrow \begin{array}{c} \mathsf{Output} \\ \mathsf{Texts} \end{array} \Rightarrow \begin{array}{c} \mathsf{Reranking} \\ \mathsf{(e.g.\ FSA)} \end{array} \Rightarrow \begin{array}{c} \mathsf{Final} \\ \mathsf{Outputs} \end{array}$$

#### **Abbreviations**

- ▶ FST = Finite State Transducer
- ► FSA = Finite State Automaton

# A closer look — syntax-based (e.g. TIBURON)

Overview

$$\begin{array}{ll} \underset{\mathsf{Text}}{\mathsf{Input}} & \Rightarrow \boxed{ \begin{array}{c} \mathsf{Translation} \\ (\mathsf{e.g.}\ \mathsf{FST}) \end{array}} \Rightarrow \underset{\mathsf{Texts}}{\mathsf{Output}} \Rightarrow \boxed{ \begin{array}{c} \mathsf{Reranking} \\ (\mathsf{e.g.}\ \mathsf{FSA}) \end{array}} \Rightarrow \underset{\mathsf{Outputs}}{\mathsf{Final}}$$

#### **Abbreviations**

- ► FST = Finite State Transducer
- ► FSA = Finite State Automaton

# A closer look — syntax-based (e.g. TIBURON)

#### Overview

$$\begin{array}{c} \mathsf{Parse} \\ \mathsf{Trees} \end{array} \Rightarrow \begin{array}{c} \mathsf{Translation} \\ \mathsf{(e.g.\ TST)} \end{array} \Rightarrow \begin{array}{c} \mathsf{Parse} \\ \mathsf{Trees} \end{array} \Rightarrow \begin{array}{c} \mathsf{Reranking} \\ \mathsf{(e.g.\ WTA)} \end{array} \Rightarrow \begin{array}{c} \mathsf{Parse} \\ \mathsf{Trees} \end{array}$$

#### **Abbreviations**

- ► TST = Tree Series Transducer
- ► WTA = Weighted Tree Automaton

# Formalization and Representation

## Parsing

- ▶ In general:  $p \colon \Sigma^* \to (T_\Delta \to [0,1])$
- ▶ Representation of p(w):  $T_{\Delta} \rightarrow [0,1]$  by WTA

# Formalization and Representation

## Parsing

- ▶ In general:  $p \colon \Sigma^* \to (\mathcal{T}_{\Delta} \to [0,1])$
- ▶ Representation of p(w):  $T_{\Delta} \rightarrow [0,1]$  by WTA

### Translation

- ▶ In general:  $\tau$ :  $(T_{\Delta} \rightarrow [0,1]) \rightarrow (T_{\Gamma} \rightarrow [0,1])$
- Implementation by TST
- ▶ but  $\tau$  should yield WTA; i.e.,  $\tau(WTA) \subseteq WTA$

# Formalization and Representation

## **Parsing**

- ▶ In general:  $p \colon \Sigma^* \to (\mathcal{T}_{\Delta} \to [0,1])$
- ▶ Representation of p(w):  $T_{\Delta} \rightarrow [0,1]$  by WTA

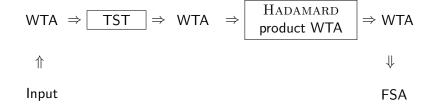
### Translation

- ▶ In general:  $\tau$ :  $(T_{\Delta} \rightarrow [0,1]) \rightarrow (T_{\Gamma} \rightarrow [0,1])$
- Implementation by TST
- ▶ but  $\tau$  should yield WTA; i.e.,  $\tau(WTA) \subseteq WTA$

## Reranking

- ▶ In general:  $r: (T_{\Gamma} \rightarrow [0,1]) \rightarrow (T_{\Gamma} \rightarrow [0,1])$
- ▶ Implementation by HADAMARD product with WTA
- can be made such that r delivers WTA

### Overview



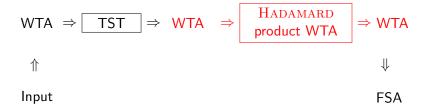
### Overview

- Application of TST to WTA
- Composition of TST
- ► HADAMARD product for WTA
- Determinization and Minimization for WTA

### Overview

- Application of TST to WTA
- Composition of TST
- ► HADAMARD product for WTA
- Determinization and Minimization for WTA

### Overview



- Application of TST to WTA
- Composition of TST
- ► HADAMARD product for WTA
- Determinization and Minimization for WTA

## Overview

- Application of TST to WTA
- Composition of TST
- ► HADAMARD product for WTA
- Determinization and Minimization for WTA