

# Related to: Machine Translation

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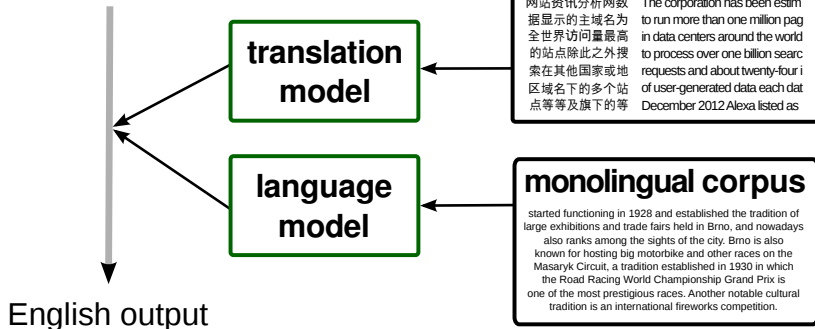
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# Topics

- ▶ Extension of translation memories
- ▶ Domain-specific machine translation
- ▶ Sub-word level NLP
- ▶ Multilingual terminology extraction

# Statistical machine translation

似乎格式有問題



# Translation memories

- ▶ used in computer-aided translation systems,
- ▶ manually built,
- ▶ relatively small and focused,
- ▶ usually in-house and not for (even academical) use.
- ▶ Goal: expand a TM to increase its coverage.
- ▶ En $\leftrightarrow$ Cs language pair.

## Word alignment matrix – from words to phrases I

	kdybys	tam	byl	,	ted'	bys	to	věděl
if								
you								
were								
there								
you								
would								
know								
it								
now								

Straightforward utilization for Computer-assisted translation →

## Word alignment matrix – from words to phrases II

	kdybys	tam	byl	,	ted'	bys	to	věděl
if	■							
you	■							
were			■					
there		■						
you						■		
would						■		
know								■
it							■	
now				■				

→ Generating new segments in translation memories

## Word alignment matrix – from words to phrases III

	kdybys	tam	byl	,	ted'	bys	to	věděl
if	■							
you	■							
were			■					
there		■						
you						■		
would						■		
know								■
it					■		■	
now					■			

→ Generating new segments in translation memories

## Evaluation: subsegments generation & combination

We used a sample of TM and a testing document provided by a Czech translation services provider; as evaluation metrics we used the one used by MemoQ (CAT system).

	<sup>s</sup> TM		<sub>sub</sub> TM		<sup>s</sup> TM+ <sub>sub</sub> TM	
	<b>Seg</b>	<b>%</b>	<b>Seg</b>	<b>%</b>	<b>Seg</b>	<b>%</b>
matches	576	6.4	1247	<b>15.67</b>	1286	<b>17.01</b>

	<sup>s</sup> TM		<sub>subjoin</sub> TM		<sup>s</sup> TM+ <sub>subjoin</sub> TM	
	<b>Seg</b>	<b>%</b>	<b>Seg</b>	<b>%</b>	<b>Seg</b>	<b>%</b>
matches	576	6.4	1917	<b>40.47</b>	1941	<b>40.89</b>



## Machine translation of subsegments, example

A sentence from MT:

*Návod na použití desinfekčního přípravku najdete na konci této brožury*

A manual translation:

*You can find instructions for use of disinfectant at the end of this brochure*

A sentence for translation:

*Návod na použití kartáče na vlasy najdete na konci této brožury*

Not in TM: *kartáče na vlasy*

Google Translate returns: *hairbrush* (after lemmatization).

→ Substitute the translation in the existing segment from TM.

# Domain-specific machine translation

- ▶ straightforward way of increasing quality of MT
- ▶ domain-specific corpora can be downloaded on demand
- ▶ separate models for each domain: **sports, cooking, gardening**
- ▶ one sense per domain: **bat**



sport



biology

- ▶ translations of
  - ▶ product details, product descriptions in e-shops,
  - ▶ manuals, warranty certificates,
  - ▶ user interface localizations, ...

# MT quality, European languages

		target language																					
		EN	BG	DE	CS	DA	EL	ES	ET	FI	FR	HU	IT	LT	LV	MT	NL	PL	PT	RO	SK	SL	SV
source language	EN	-	40.5	46.8	52.6	50.0	41.0	55.2	34.8	38.6	50.1	37.2	50.4	39.6	43.4	39.8	52.3	49.2	55.0	49.0	44.7	50.7	52.0
	BG	61.3	-	38.7	39.4	39.6	34.5	46.9	25.5	26.7	42.4	22.0	43.5	29.3	29.1	25.9	44.9	35.1	45.9	36.8	34.1	34.1	39.9
	DE	53.6	26.3	-	35.4	43.1	32.8	47.1	26.7	29.5	39.4	27.6	42.7	27.6	30.3	19.8	50.2	30.2	44.1	30.7	29.4	31.4	41.2
	CS	58.4	32.0	42.6	-	43.6	34.6	48.9	30.7	30.5	41.6	27.4	44.3	34.5	35.8	26.3	46.5	39.2	45.7	36.5	43.6	41.3	42.9
	DA	57.6	28.7	44.1	35.7	-	34.3	47.5	27.8	31.6	41.3	24.2	43.8	29.7	32.9	21.1	48.5	34.3	45.4	33.9	33.0	36.2	47.2
	EL	59.5	32.4	43.1	37.7	44.5	-	54.0	26.5	29.0	48.3	23.7	49.6	29.0	32.6	23.8	48.9	34.2	52.5	37.2	33.1	36.3	43.3
	ES	60.0	31.1	42.7	37.5	44.4	39.4	-	25.4	28.5	51.3	24.0	51.7	26.8	30.5	24.6	48.8	33.9	57.3	38.1	31.7	33.9	43.7
	ET	52.0	24.6	37.3	35.2	37.8	28.2	40.4	-	37.7	33.4	30.9	37.0	35.0	36.9	20.5	41.3	32.0	37.8	28.0	30.6	32.9	37.3
	FI	49.3	23.2	36.0	32.0	37.9	27.2	39.7	34.9	-	29.5	27.2	36.6	30.5	32.5	19.4	40.6	28.8	37.5	26.5	27.3	28.2	37.6
	FR	64.0	34.5	45.1	39.5	47.4	42.8	60.9	26.7	30.0	-	25.5	56.1	28.3	31.9	25.3	51.6	35.7	61.0	43.8	33.1	35.6	45.8
	HU	48.0	24.7	34.3	30.0	33.0	25.5	34.1	29.6	29.4	30.7	-	33.5	29.6	31.9	18.1	36.1	29.8	34.2	25.7	25.6	28.2	30.5
	IT	61.0	32.1	44.3	38.9	45.8	40.6	26.9	25.0	29.7	52.7	24.2	-	29.4	32.6	24.6	50.5	35.2	56.5	39.3	32.5	34.7	44.3
	LT	51.8	27.6	33.9	37.0	36.8	26.5	21.1	34.2	32.0	34.4	28.5	36.8	-	40.1	22.2	38.1	31.6	31.6	29.3	31.8	35.3	35.3
	LV	54.0	29.1	35.0	37.8	38.5	29.7	8.0	34.2	32.4	35.6	29.3	38.9	38.4	-	23.3	41.5	34.4	39.6	31.0	33.3	37.1	38.0
	MT	72.1	32.2	37.2	37.9	38.9	33.7	48.7	26.9	25.8	42.4	22.4	43.7	30.2	33.2	-	44.0	37.1	45.9	38.9	35.8	40.0	41.6
	NL	56.9	29.3	46.9	37.0	45.4	35.3	49.7	27.5	29.8	43.4	25.3	44.5	28.6	31.7	22.0	-	32.0	47.7	33.0	30.1	34.6	43.6
	PL	60.8	31.5	40.2	44.2	42.1	34.2	46.2	29.2	29.0	40.0	24.5	43.2	33.2	35.6	27.9	44.8	-	44.1	38.2	38.2	39.8	42.1
	PT	60.7	31.4	42.9	38.4	42.8	40.2	60.7	26.4	29.2	53.2	23.8	52.8	28.0	31.5	24.8	49.3	34.5	-	39.4	32.1	34.4	43.9
	RO	60.8	33.1	38.5	37.8	40.3	35.6	50.4	24.6	26.2	46.5	25.0	44.8	28.4	29.9	28.7	43.0	35.8	48.5	-	31.5	35.1	39.4
	SK	60.8	32.6	39.4	48.1	41.0	33.3	46.2	29.8	28.4	39.4	27.4	41.8	33.8	36.7	28.5	44.4	39.0	43.3	35.3	-	42.6	41.8
	SL	61.0	33.1	37.9	43.5	42.6	34.0	47.0	31.1	28.8	38.2	25.7	42.3	34.6	37.3	30.0	45.9	38.2	44.1	35.8	38.9	-	42.7
	SV	58.5	26.9	41.0	35.6	46.6	33.3	46.6	27.4	30.9	38.9	22.7	42.0	28.2	31.0	23.7	45.6	32.2	44.2	32.7	31.3	33.5	-

# Sub-word level machine translation

- ▶ SMT principle applied on character level
- ▶ translation on subword level (English → Czech)
  - ed → -án, -al, -aný; ex- → vy-
  - worked → dělal
  - exhausted → vyčerpaný
- ▶ translation across levels
  - with → -em; user → -ák
  - with knife → nožem
  - linux user → linuxák

## Sub-word level: other possible advantages

- ▶ experiments with PoS tagging
- ▶ -á, -lá, -alá, -malá
- ▶ lyžiny X ližiny (typos)
- ▶ edit distance
- ▶ language modelling

# Multilingual terminology extraction

- ▶ input: examined parallel corpus for A  $\Leftrightarrow$  B; reference corpora for A, B; terminology grammar for A, B
- ▶ output: statistically significant keywords/terms, sorted by parallel corpus co-occurrence statistics

prevalence	prévalence
soap	savon
survival	survie
education	éducation
primary prevention	prévention primaire
condom	préservatif
chronological age	âge chronologique
basic information	informations de base
acid	acide
universal access	accès universel
international guidance	directives internationales
stigma	stigmatisation
fish	poisson
pregnancy	grossesse
alcohol	alcool
public health	santé publique
disability	handicap
secondary school age	pourcentage du nombre total
training	formation
unemployment	chômage
access	accès
physical appearance	apparence physique
percentage of injecting drug	injection stérile