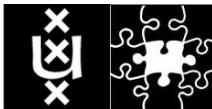


Modelling the Adjunct/Argument Distinction in Hierarchical Phrase-Based Translation

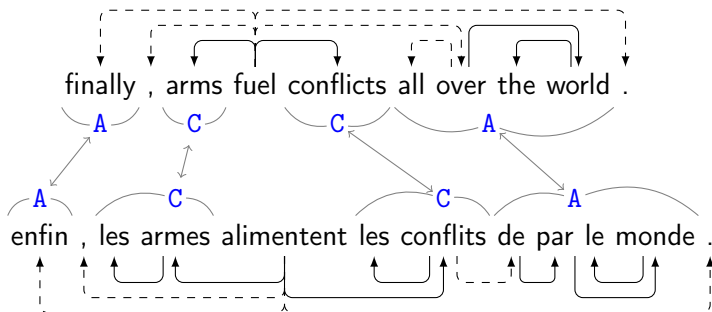
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The Adjunct/Argument Distinction for Hiero



Minimally explain recursion in Hiero

- ▶ distinction is semantically driven
- ▶ adjunction is a central device for recursion

Interpretation of the Adjunct/Argument Distinction

A restrictive interpretation of the adjunct/argument distinction

- ▶ not modelling selectional preferences as in STAG
- ▶ adjuncts and arguments are interpreted as types in SCFG

Interpretation of adjuncts

- ▶ adjuncts as modifiers
- ▶ not only in semantic frames

Model

- ▶ Syntax-Augmented Machine Translation (SAMT)
 - ▶ labelled Hiero model
 - ▶ phrase labels derived from syntactic annotations through combinatory rules
- ▶ unlike SAMT
 - ▶ minimal labels
 - ▶ bilingual source/target annotations
- ▶ phrase-length constraint (10 tokens)
 - ▶ no labelled reordering at sentence level

Labelling procedure

Procedure

- ▶ adjunct/argument labels
- ▶ combinatory rules for phrase labels
- ▶ (bilingual) phrase-pair labels

Adjunct/Argument labels

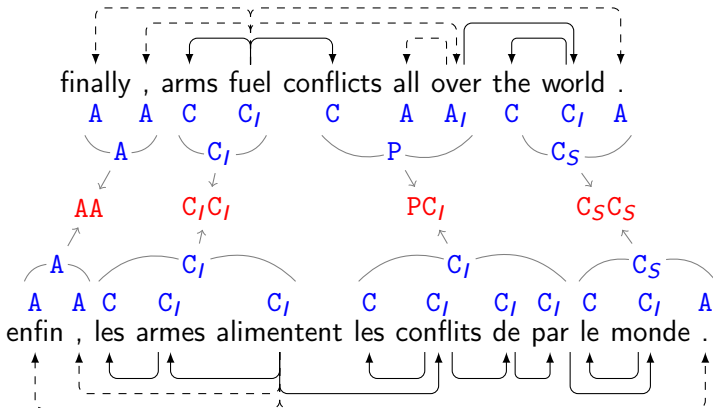
- ▶ use dependency annotations
- ▶ map *modifier* and *punctuation* labels to adjuncts

Combinatory Rules for Phrase Labels

- ▶ derive phrase labels from adjunct (A) and argument (C) labels
- ▶ SAMT-like combinatory rules
- ▶ extension is minimal and reflects characteristics of adjunction

	<i>phrase type</i>	<i>resulting label</i>
<i>if</i>	constituent	A or C
<i>else if</i>	constituent sequence	
	<i>if all adjuncts</i>	A
	<i>else</i>	C _S
<i>else if</i>	const. less subconstituents	
	<i>if all adjuncts</i>	A or C
	<i>else</i>	A _I or C _I
<i>else</i>		P

Labelled Models



First Results

- ▶ French-English Europarl
- ▶ in-domain LM data, dev/test sets
- ▶ training with 200k sentence pairs

	labels	BLEU		METEOR		TER	
		dev	test	dev	test	dev	test
Hiero	1	32.1	31.8	34.9	34.8	52.9	53.3
AA-Src	6	31.9 ^{▽▽}	31.3 ^{▽▽}	34.8 [▽]	34.7 ^{▽▽}	53.0	53.5 ^{▽▽}
AA-Trg	6	32.0 [▽]	31.6 ^{▽▽}	34.9	34.7 [▽]	52.9	53.5 ^{▽▽}
AA-Bi	36	31.9 [▽]	31.5 ^{▽▽}	34.8	34.7 ^{▽▽}	53.0	53.5 [▽]

Relabelling by Clustering

- ▶ compare labels according to their *lhs/rhs* behaviour
- ▶ two-component distance
 - ▶ lhs distance

$$d_{LHS} = \sum_{RHS} |\Delta_{LHS} P(rhs|lhs)|$$

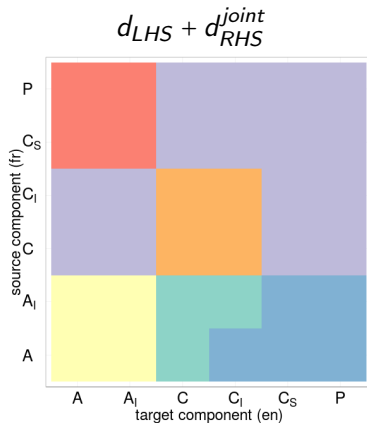
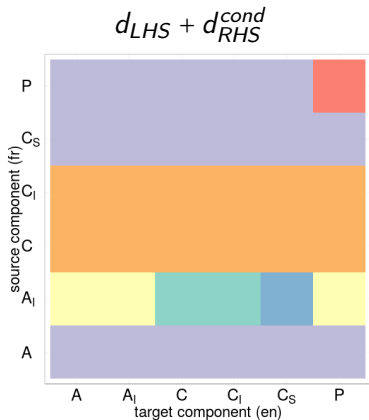
- ▶ rhs distance

$$d_{RHS}^{cond} = \sum_{LHS} |\Delta_{RHS} P(lhs|rhs)|$$

$$d_{RHS}^{joint} = \sum_{LHS} |\Delta_{RHS} P(lhs, rhs)|$$

- ▶ probabilities estimated from the dev-set AA-Bi grammar
- ▶ clustering stops at six clusters

Label Clusters



Results with Clustered Labels (1)

	labels	BLEU		METEOR		TER	
		dev	test	dev	test	dev	test
AA-Bi	36	31.9	31.5	34.8	34.7	53.0	53.5
Cl-cond	6	31.8 [▼]	31.4	34.8	34.7	53.1	53.6
Cl-joint	6	31.9	31.8^{^^}	34.9	34.8^{^^}	53.0	53.3^{^^}

Results with Clustered Labels (2)

	labels	BLEU		METEOR		TER	
		dev	test	dev	test	dev	test
Hiero	1	32.1	31.8	34.9	34.8	52.9	53.3
Cl-cond	6	31.8 ^{▽▽}	31.4 ^{▽▽}	34.8	34.7 [▽]	53.1 ^{▽▽}	53.6 ^{▽▽}
Cl-joint	6	31.9 ^{▽▽}	31.8	34.9	34.8	53.0	53.3

Future Work

- ▶ better method to reshape the bilingual-label set
 - ▶ clustering works, but only allows merging
- ▶ lift phrase-length constraint
 - ▶ reordering rules
 - ▶ swap for recursion constraint
- ▶ extend experimental set-up
 - ▶ other language pairs

Thank you.