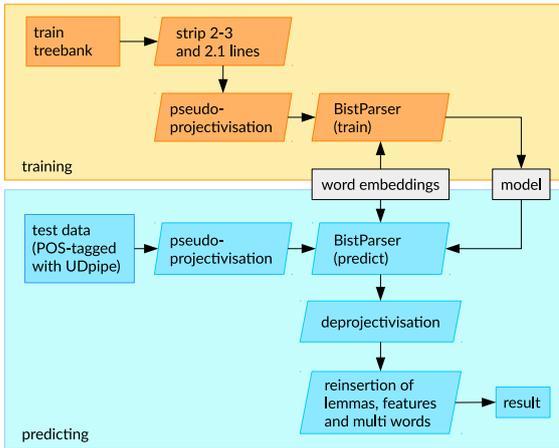




# Multi-Model and Crosslingual Dependency Analysis

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## Architecture



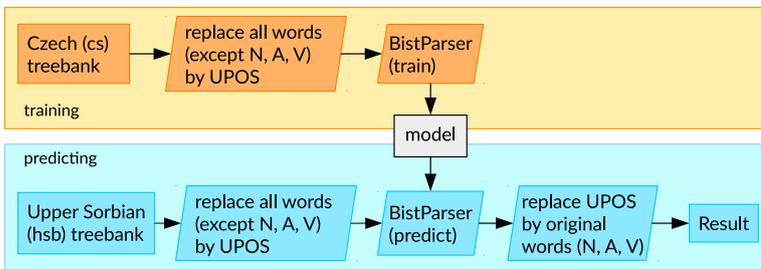
BistParser modifications: One dependency tree per sentence

Training:

- hidden layer size 40, 50 or 100, depending on language
- other BistParser options used: `--k 3 --lstm dims 125 --lstm layers 2 --bibi-lstm --usehead --userl`
- word embeddings for all languages (except Gothic)
  - all words in lowercase (if applicable)
  - punctuation separated from words
  - word2vec standard options except `-size {300,500}` and `-window 10`

## Surprise Languages

Two crosslingual approaches: training (1) on a mix of 23 languages and (2) on a typologically close language (*hsb* → *cs*, *sme* → *fi*, *kmr* → *fa*, *bxr* → *hi*), both without word embeddings: (2) gave much better results.



Example of modified CONLL (cols. 1, 2 and 4) used for training (i.e. *cs*, shown below left) and prediction (in this case *hsb*, below right):

training data ( <i>cs</i> )			test data ( <i>hsb</i> )		
1	<i>Manažeři</i>	NOUN	1	Njejsu	VERB
2	<i>rozhodují</i>	VERB	2	DET	DET
3	ADV	ADV	3	archeologiske	ADJ
4	ADP	ADP	4	doktady	NOUN
5	<i>místě</i>	NOUN	5	ADP	ADP
6	PUNCT	PUNCT	...		

	23 language mix	Upper Sorbian ( <i>hsb</i> )	Northern Sami ( <i>sme</i> )	Kurmanji ( <i>kmr</i> )	Buryat ( <i>bxr</i> )
Upper Sorbian (100 <sup>1</sup> )	63.2%	<b>cs (100) 69.5%</b>	<b>fi (100) 52.9%</b>	<b>fa (100) 36.7%</b>	<b>hi (50) 32.0%</b>
Northern Sami (50)	49.2%	cs (50) 67.5%	fiu <sup>2</sup> (100) 51.7%	fa (50) 35.8%	ur (50) 28.0%
Kurmanji (100)	29.2%	pl (50) 56.9%	fiu (50) 49.7%	hi (50) 22.2%	tr (100) 27.6%
Buryat (50)	26.3%	pl (100) 51.9%	fi (50) 50.8%	ur (50) 20.6%	fi (100) 21.8%
					ja (50) 18.0%

<sup>1</sup> Number indicates hidden layer size. <sup>2</sup> Mix of Fenno-Ugric languages, here *fi*, *et* and *hu*.

## Results

- 10<sup>th</sup> position with LAS 68.61% (improved to 69.75% after bug fixes)
- 9<sup>th</sup> position with Content Word LAS (CLAS) as evaluation metrics: 64.15%
- 8<sup>th</sup> position on surprise languages: 38.72% (7<sup>th</sup> position with CLAS: 34.28%)

Runtime (on Tira VM, Ubuntu Xenial): 3 hours (all treebanks), using <16GB