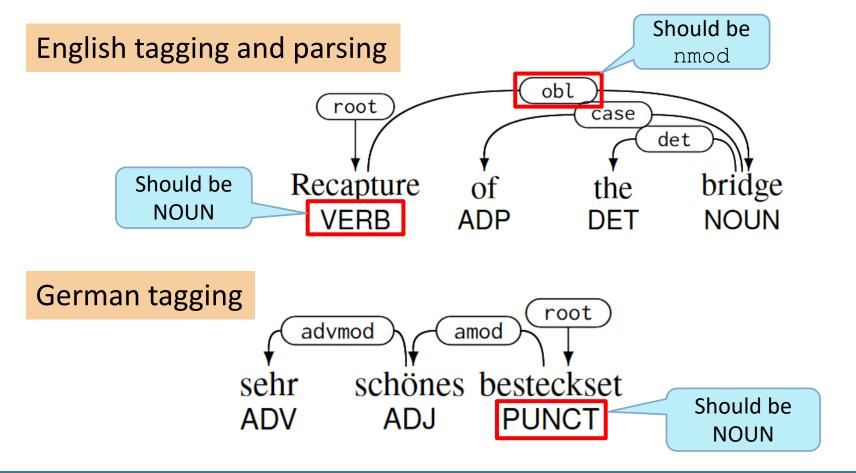
# Automatic Manipulation of Training Corpora to Make Parsers Accept Real-world Text

Hiroshi Kanayama, Ran Iwamoto, Masayasu Muraoka, Takuya Ohko, Kohtaroh Miyamoto

IBM Research - Tokyo

## Frustrating examples: tagging and parsing errors in noun phrases

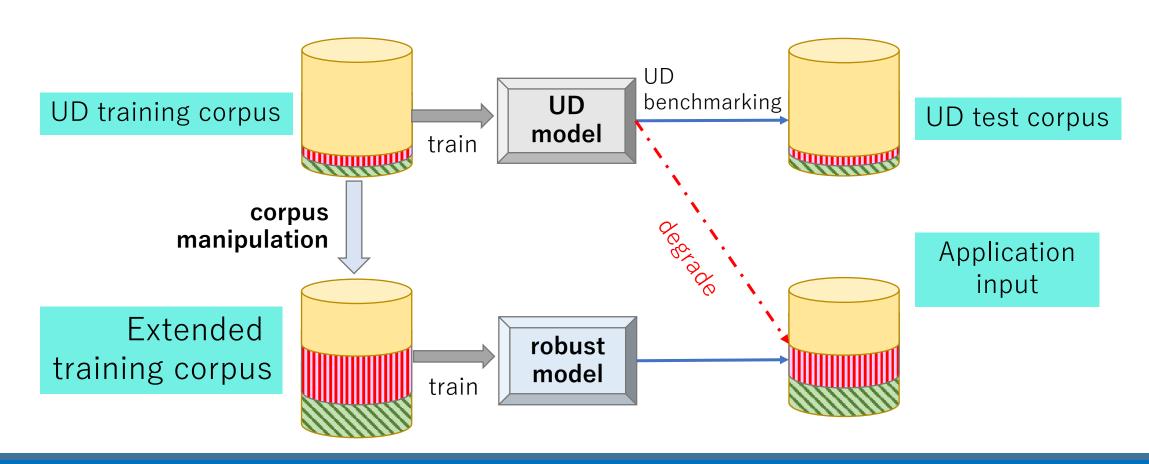


#### Noun phrases and omitted punctuation – Appear in real input, but not in UD corpora



- Frequently appear in real-word text
  - Title of documents and sections
  - Informal data, Review comments, ...
- Not appear in UD corpora
  - Not in training data → Existing parsers cannot handle
  - Not in test data → This problem was overlooked

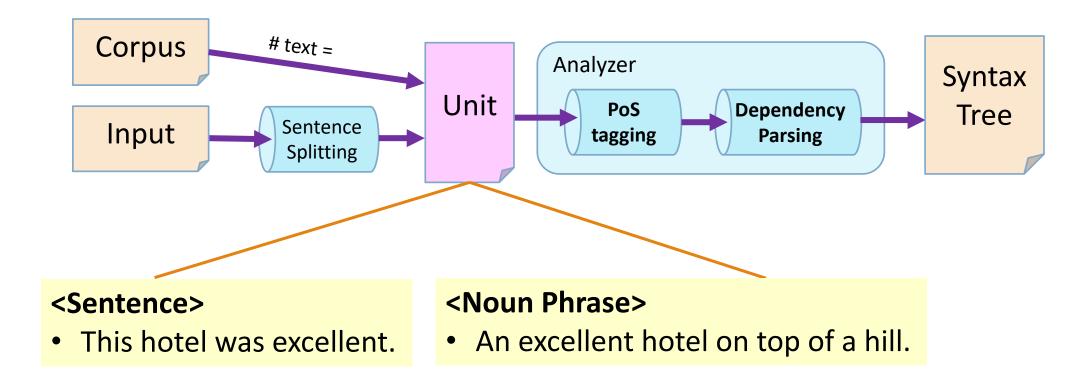
#### Discrepancy between UD and real-word -> Automatic manipulation of training corpora



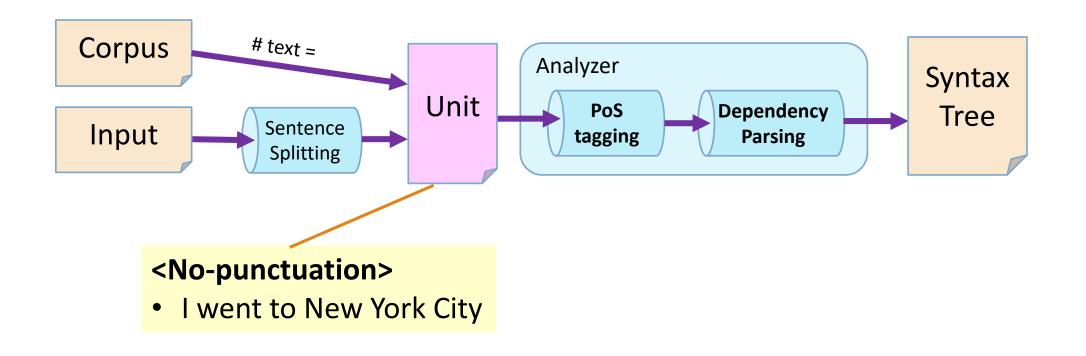
- 1. Problem setting corpus discrepancy
- 2. Corpus Manipulation
- 3. Evaluation
  - Unit test with noun phrase data
  - Intrinsic and extrinsic evaluation

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### Sentence vs. noun phrase in a unit to apply tagging and parsing



### No-punctuation: omitted period at the end of a unit



#### Ratios of noun phrases and no-punctuation are very different between UD and Review data

	Noun ph	ırase (%)	No-punctuation (%)			
	UD	Review	UD	Review		
German	2.4	28.0	0.4	12.0		
French	2.6	36.0	1.9	3.0		
Spanish	2.6	25.0	0.2	7.0		
English	6.5	3.0	14.0	1.0		

#### UD:

Wir hatten wunderschöne Spaziergänge und die Städte der Region mit Ihren Gründerzeithäusern sind sehenswert.

Review: (SemEval, etc.)

Ein gutes Besteck für jeden Tag.

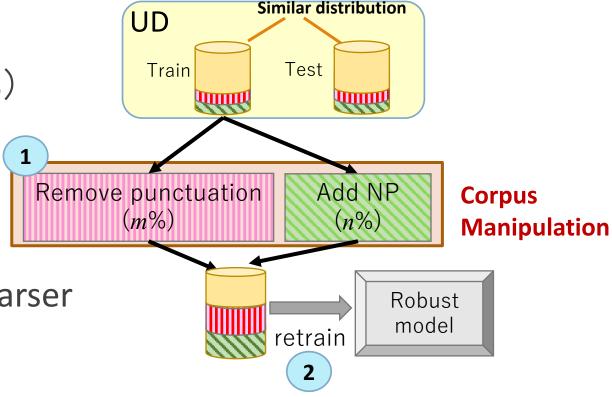
UD\_English-EWT

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#### To overcome the corpus discrepancy manipulate training corpus and retrain the model

- 1. Corpus manipulation
- Removing punctuation (m%)
- Adding noun phrases (n%)

- 2. Model retraining
  - PoS tagger + dependency parser
- Tested on Stanza parser



#### Remove punctuation: Just remove sentence-end periods in m% of units

```
1 His
                   PRON
                           PRP$
                                   Gender=Masc|Number=Sing|Person=3
                                                                       3 nmod:poss
          he
2 superior superior
                   ADJ
                           JJ
                                   Degree=Pos
                                                                       3 amod
                                   Number=Plur
3 officers
          officer
                   NOUN
                           NNS
                                                                       4 nsubi
4 said
                   VERB
                           VBD
                                   Mood=Ind|Tense=Past|VerbForm=Fin
          say
                                                                       0 root
5 OK
                   INTJ
                           UH
                                                                                         SpaceAfter=No
          ok
                                                                       4 obj
6.
                   PUNCT .
                                                                       4 punct
```

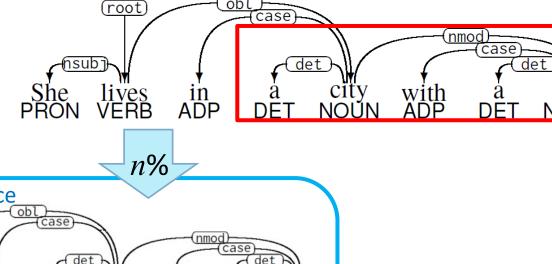


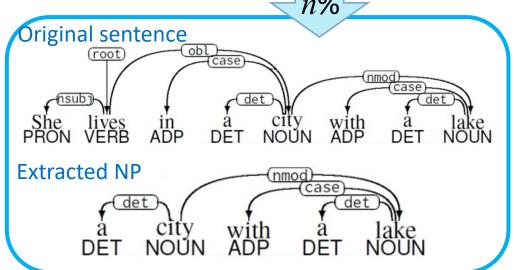
```
1 His
          he
                   PRON
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                                   Gender=Masc|Number=Sing|Person=3
                                                                       3 nmod:poss
2 superior superior
                   ADJ
                           JJ
                                   Degree=Pos
                                                                       3 amod
3 officers
          officer
                   NOUN
                           NNS
                                   Number=Plur
                                                                       4 nsubi
4 said
                   VERB
                           VBD
                                   Mood=Ind|Tense=Past|VerbForm=Fin
                                                                       0 root
          say
5 OK
          ok
                   INTJ
                            UH
                                                                       4 obi
                                                                                         SpaceAfter=No
```

## Increase noun phrases by n%, by extracting noun phrases in sentences

- Detect noun phrases (non-root)
  - Subtree consists of >= 4 words headed by "NOUN"
  - Exclude words of case and punct

 Randomly pick up NPs to increase the training corpus to (100+n)%

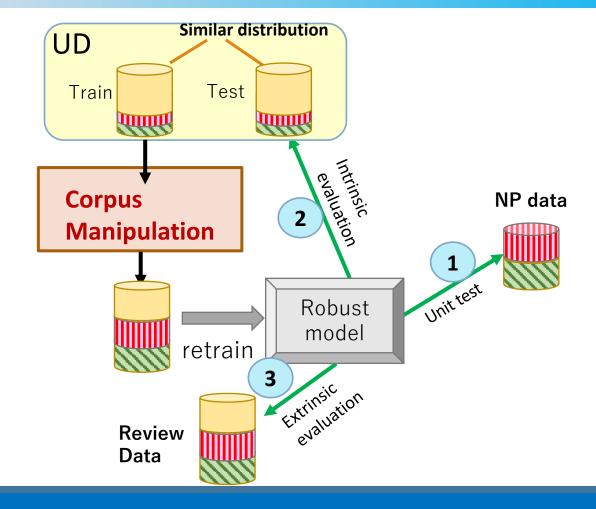




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#### Conduct three types of evaluation with the retrained model

- 1. Unit test on Noun Phrase Data
  - The root word is tagged as NOUN?
  - Isn't there terrible PUNCT errors?
- 2. Intrinsic evaluation on UD
  No degrade on the parsing score?
- **3. Extrinsic evaluation** on **Review Data** Sentiment extraction is improved?



### Generated Noun Phrase Data using Wikipedia's section titles

- Wikipedia section titles, 3 words or more
- Exclude ones with special characters
- Subsampling to diversify
- → Obtained 1,500 instances per language

#### **English**:

boundary extension and different brains ties with groups marked as terror organizations evidence for innate language capacities

#### French:

panthéon de la musique canadienne commandeurs avec plaque viroïde de la maladie des tubercules en fuseau



https://en.wikipedia.org/wiki/Morning\_Musume

# Successfully avoid NP and no-punct problems without degrading general sco Sometimes improved

					Sometimes improved		
German	Remove Punct	Add NP	Unit	Test	Intrinsic	Extrinsic	
Varying m and n	m%	n%	NOUN (个)	Wrong Punct (↓)	LAS on UD	Sentiment F2	
	0	0	97.4	3.2	79.68	81.2	
Baseline:	0	20	97.7	0	79.64	81.7	
UD as it is	0	50	98.1	0	79.23	80.2	Good balance
	0	100	98.4	0	79.60	80.5	m and $n$
	10	10	97.8	0	79.87	82.8	
The better, the more NPs added	20	P	97.1		78.98	80.9	
	20	10	9/.5	Perfectly 0	80.20	82.2	
	50	0	removed stu PUNCT erro	<u> </u>	79.73	1 3 . 1	ng all punctuation
	100	6	97.4	0	76.78	80.3	s not good

## Good results in 4 languages in all aspects though the optimal *m* and *n* are different

French

	<u> </u>		9			
German	m	n	UD	Sentiment	NP	wrong PUNCT
German	0	0	79.68	81.2	97.4	3.2
	0	20	79.64	81.7	97.7	0
	0	50	79.23	80.2	98.1	0
	0	100	79.60	80.5	98.4	0
	10	10	79.87	82.8	97.8	0
	20	0	78.98	80.9	97.1	0
	20	10	80.20	82.2	97.5	0
	50	0	79.73	79.7	97.3	0
	100	0	76.78	80.3	97.4	0
Spanish	m	n	UD	Sentiment	NP	wrong PUNCT
	0	0	87.58	69.8	91.5	4.1
	0	10	88.21	69.4	93.1	1

87.37

87.59

87.67

87.28

87.28

87.52

86.83

71.1

70.0

68.4

69.2

69.7

70.1

70.4

94.2

94.7

92.7

93.5

93.1

91.0

91.9

50

100

0

10

20

20

50

100

	10	10	87.09	74.3	93.2
	20	0	87.31	73.5	90.6
	20	10	87.19	73.5	92.9
	50	0	87.57	74.7	91.1
	100	0	84.57	73.2	92.3
English	m	n	UD	Sentiment	NP
	0	0	83.84	78.7	91.6
	0	10	84.09	78.8	93.9
	0	50	83.88	78.4	95.3
	0	100	84.00	78.5	95.3
	10	0	83.81	78.2	91.7
	10	10	83.71	78.8	94.2
	50	0	84.03	79.5	91.4
	50	50	83.75	77.6	95.4

83.46

UD

87.14

87.25

86.76

86.37

0

50

100

0

0

100

Sentiment

73.9

74.9

74.0

74.5

78.7

90.1

NP

91.4

93.2

94.4

95.5

wrong PUNCT

wrong PUNCT

0.7

4.2

#### IBM Research

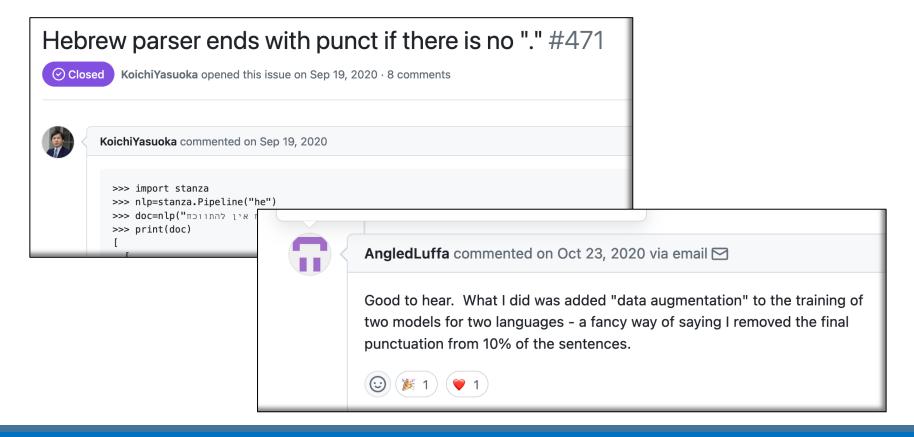
#### Conclusion

### Corpus manipulation made parsers more robust for real-world input

- Handing of Noun Phrases and no-punctuation
  - Confirmed discrepancy between UD corpora and real text
  - Proposed algorithms of automatic conversion
- Showed results in 4 languages
  - Improvements in unit test, intrinsic (UD) and extrinsic (SA) evaluation
  - Worked in English as well, even with different trends
  - Future work: cover other languages (e.g. Japanese)

#### Should UD corpora be modified?

https://github.com/stanfordnlp/stanza/issues/471



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