

Coreference without Borders

4 years of CorefUD and CRAC Shared Tasks

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Outline

1. Introduction
2. CorefUD
3. CRAC Shared tasks
4. LLMs for coreference
5. Conclusion

Introduction

Coreference

- two or more expressions in the text (mentions) refer to the same discourse entity

Beethoven was a musical genius. *The German composer* began going deaf in *his* late twenties, yet *he* continued to compose masterpieces.

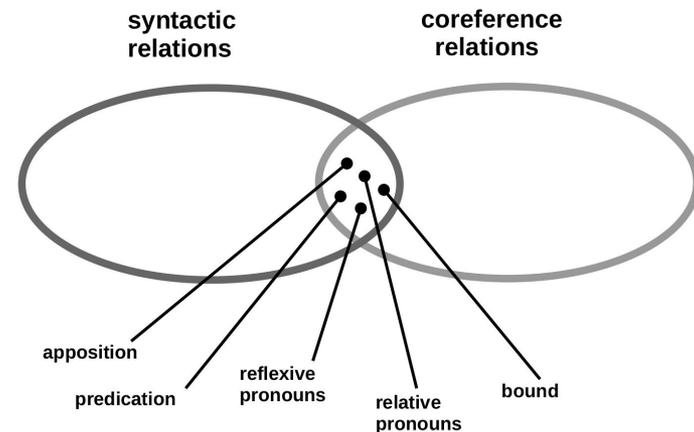


- in some languages, mentions might not be even expressed on the surface (zero mentions)

Beethoven byl hudební génius. *Německý skladatel* začal ztrácet sluch ve *svých* dvaceti letech, přesto \emptyset *dál skládal mistrovská díla.*

Linguistic motivations

- strong interplay of coreference and syntax
 - mentions often correspond to syntactically meaningful units (noun phrases, subject)
 - some coreference relations are expressed primarily by syntactic means (reflexive and relative constructions, apposition, predication with copula)
 - syntax is useful for the identification of zero expressions (such as pro-drop) needed for coreference
- long tradition of this approach in Prague
 - Hajičová, Panevová, Sgall:
Coreference in the grammar and in the text (1985)
 - PDT, PCEDT



Diversity in existing resources

- original resources in CorefUD 0.1

CorefUD dataset	Coref. grouping		Relations among mentions					
	cluster-based	link-based	singletons	appos.	pred.	split antec.	disc. deixis	bridg.
Catalan-AnCora	✓	×	✓	✓	✓	✓	✓	×
Czech-PCEDT	×	✓	(✓)	(✓)	(✓)	✓	✓	×
Czech-PDT	×	✓	(✓)	(✓)	(✓)	✓	✓	✓
English-GUM	✓	×	✓	✓	✓	✓	✓	✓
English-ParCorFull	✓	×	×	✓	(✓)	✓	✓	×
French-Democrat	✓	×	✓	×	×	×	×	×
German-ParCorFull	✓	×	×	✓	(✓)	✓	✓	×
German-PotsdamCC	×	✓	✓	✓	✓?	×	✓	×
Hungarian-SzegedKoref	✓	×	×	✓	?	×	✓	✓
Lithuanian-LCC	×	✓	×	×	×	✓	×	×
Polish-PCC	✓	×	✓	✓	✓	×	✓	✓
Russian-RuCor	✓	×	×	✓	✓	×	×	×
Spanish-AnCora	✓	×	✓	✓	✓	✓	✓	×
Dutch-COREA	×	✓	✓	✓	✓	×	✓	✓
English-ARRAU	✓	✓	✓	✓	✓	✓	✓	✓
English-OntoNotes	✓	×	×	✓	×	×	✓	×
English-PCEDT	×	✓	(✓)	(✓)	(✓)	✓	✓	×

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Czech-PCEDT	×	✓	(✓)	(✓)	(✓)	✓	✓	×
Czech-PDT	×	✓	(✓)	(✓)	(✓)	✓	✓	✓
English-GUM	✓	×	✓	✓	✓	✓	✓	✓
English-ParCorFull	✓	×	×	✓	(✓)	✓	✓	×
French-Democrat	✓	×	✓	×	×	×	×	×
German-ParCorFull	✓	×	×	✓	(✓)	✓	✓	×
German-PotsdamCC	×	✓	✓	✓	✓?	×	✓	×
Hungarian-SzegedKoref	✓	×	×	✓	?	×	✓	✓
Lithuanian-LCC	×	✓	×	×	×	✓	×	×
Polish-PCC	✓	×	✓	✓	✓	×	✓	✓
Russian-RuCor	✓	×	×	✓	✓	×	×	×
Spanish-AnCora	✓	×	✓	✓	✓	✓	✓	×
Dutch-COREA	×	✓	✓	✓	✓	×	✓	✓
English-ARRAU	✓	✓	✓	✓	✓	✓	✓	✓
English-OntoNotes	✓	×	×	✓	×	×	✓	×
English-PCEDT	×	✓	(✓)	(✓)	(✓)	✓	✓	×

- different formats

Coreference Resolution systems

Paper	Model	\emptyset /ELMo/ base PLM	large PLM ~350M	xl PLM ~3B	xxl PLM ~11B	NN calls
Lee et al. (2017)	e2e	67.2 \emptyset				1
Lee et al. (2018)	e2e	70.4 _{ELMo}				1
Lee et al. (2018)	c2f	73.0 _{ELMo}				1
Joshi et al. (2019)	c2f	73.9 _{BERT}	76.9 _{BERT}			1
Joshi et al. (2020)	c2f		79.6 _{SpanB}			1
Kirstain et al. (2021)	s2e		80.3 _{Longf}			1
Otmazgin et al. (2023)	LingMess/s2e		81.4 _{Longf}			1
Dobrovolskii (2021)	WL		81.0 _{RoBE}			1
D'Oosterlinck et al. (2023)	CAW/WL		81.6 _{RoBE}			1
Liu et al. (2022)	ASP	76.6 _{T5}	79.3 _{T5}	82.2 _{FT5}	82.5 _{FT5}	$\mathcal{O}(n)$
Bohnet et al. (2023)	seq2seq			78.0 _{mT5} ^{dev}	83.3 _{mT5}	$\mathcal{O}(n)$
Wu et al. (2020)	CorefQA	79.9 _{SpanB} ^{+QA}	83.1 _{SpanB} ^{+QA}			$\mathcal{O}(n)$
Straka (2023)	CorPipe		80.7 _{T5}	82.0 _{FT5}		1
Straka (2023)	CorPipe		77.2 _{mT5}	78.9 _{mT5}		1

from Straka (2023)

Coreference Resolution systems

evaluated
only on
English
OntoNotes
(and GAP in
some cases)

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Lee et al. (2017)	e2e	67.2 _∅				1
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from Straka (2023)

Universal Dependencies

- framework for consistent annotation of grammar (morphology and dependency syntax) across different languages
- successful in:
 - establishing an annotation standard
 - facilitating NLP research
 - serving as a resource for linguistic studies



Universal Dependencies

- framework for consistent annotation of grammar (morphology and dependency syntax) across different languages
- successful in:
 - establishing an annotation standard
 - facilitating NLP research
 - serving as a resource for linguistic studies
- Dan Zeman in both teams



CorefUD

CorefUD timeline



- a multi-lingual collection of corpora annotated with coreference and anaphora
- harmonized using the same annotation scheme
- combines annotation of coreference/anaphora (always manual) with annotation of morphology and dependency syntax (manual if available, otherwise automatic)
- Universal Dependencies (Nivre et al., 2017)
 - source of inspiration
 - keeping the maximum compliance with its standards
- CorefUD 1.3 (Novák et al., 2025)
 - <http://hdl.handle.net/11234/1-5896>
 - 6th release since 2021
 - 28 datasets for 18 languages

Public

- Ancient Greek-PROIEL (Haug and Jøhndal, 2008)
- Ancient Hebrew-PTNK (Swanson et al., 2024)
- Catalan-AnCora (Recasens and Martí, 2010)
- Czech-PCEDT (Nedoluzhko et al., 2016)
- Czech-PDT (Hajič et al., 2020)
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- French-ANCOR (Muzerelle et al., 2014)
- French-Democrat (Landragin, 2021)
- German-ParCorFull (Lapshinova-Koltunski et al., 2018)
- German-PotsdamCC (Bourgonje and Stede, 2020)

Non-public

- Dutch-COREA (Hendrickx et al., 2008)
- English-ARRAU (Uryupina et al., 2020)

- Hindi-HDTB (Mujadia et al., 2016)
- Hungarian-KorKor (Vadász, 2022)
- Hungarian-SzegedKoref (Vincze et al., 2018)
- Korean-ECMT (Nam et al., 2020)
- Lithuanian-LCC (Žitkus and Butkienė, 2018)
- Norwegian-BokmaalNARC (Mæhlum et al., 2022)
- Norwegian-NynorskNARC (Mæhlum et al., 2022)
- Old Church Slavonic-PROIEL (Haug and Jøhndal, 2008)
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- Russian-RuCor (Toldova et al., 2014)
- Spanish-AnCora (Recasens and Martí, 2010)
- Turkish-ITCC (Pamay and Eryiğit, 2018)

- English-OntoNotes (Weischedel et al., 2011)
- English-PCEDT (Nedoluzhko et al., 2016)

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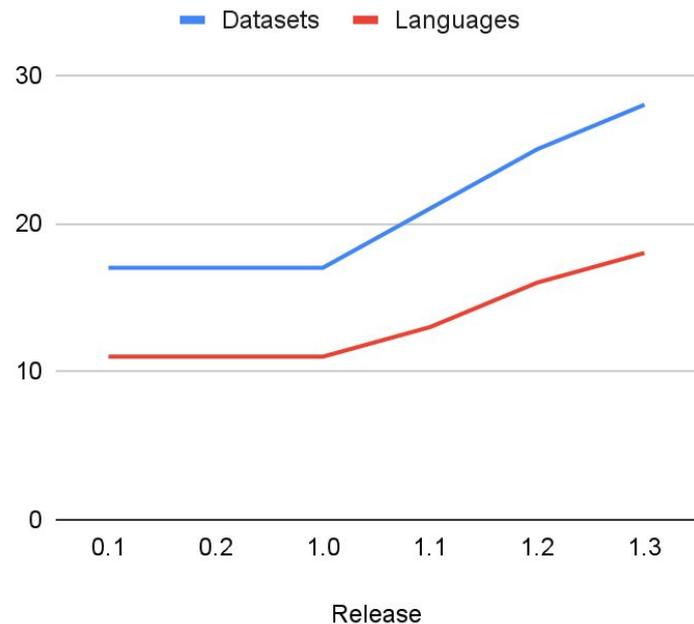
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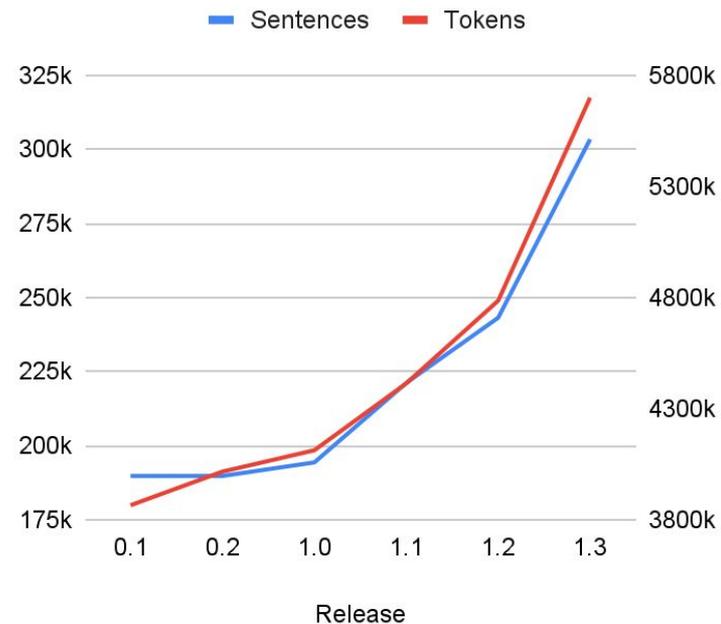
- English-OntoNotes (Weischedel et al., 2011)
- English-PCEDT (Nedoluzhko et al., 2016)

Size over time

Datasets and Languages



Sentences and Tokens



- CorefUD 1.0 format
 - since CorefUD 1.0
 - fully compliant with the CoNLL-U format
 - may be included in UD releases
 - represented in the MISC field

```
# sent_id = ln94200-149-p2s3
# text = Pokud nebude jeho smlouva zrušena, je rozhodnut zanechat vůbec fotbalu, uvedl manažer brazilského hráče Ricardo Fuica.
# orig_file_sentence ln94200_149#5
1 Pokud        pokud        SCONJ J,----- _                5 mark          5:mark          _
2 nebude       být          AUX      VB-S---3F-NAI-- Aspect=... 5 aux:pass      5:aux:pass      _
3 jeho         jeho         DET      P9XXXZS3----- Gender[... 4 det           4:det           Entity=(e62601--1-gstype:spec) | Functor=4:APP
4 smlouva      smlouva     NOUN     NNFS1-----A---- Case=No... 5 nsubj:pass    5:nsubj:pass    Functor=5:PAT
5 zrušena      zrušený     ADJ      VsQW----X-APP-- Aspect=... 8 advcl        8:advcl:pokud  SpaceAfter=No | LDeriv=zrušit | Functor=8:COND
6 ,            ,            PUNCT    Z:----- _                5 punct        5:punct
7 je           být          AUX      VB-S---3P-AAI-- Aspect=... 8 cop          8:cop          Functor=8:EFF
7.1 on         #PersPron   PRON     _                Case=No... _            8:nsubj|9:nsubj:xsubj Entity=(e62601--1-gstype:spec) | Functor=8:ACT.cop, 9:ACT
8 rozhodnut   rozhodnutý  ADJ      VsYS----X-APP-- Aspect=... 13 ccomp       13:ccomp       LDeriv=rozhodnout | Functor=13:PAT
9 zanechat    zanechat    VERB     Vf-----A-P--  Aspect=... 8 xcomp       8:xcomp       Functor=8:MANN
10 vůbec      vůbec       PART     TT----- _                11 advmod:emph 11:advmod:emph Functor=11:EXT
11 fotbalu    fotbal      NOUN     NNIS2-----A---- Animacy... 9 obl:arg      9:obl:arg:gen  SpaceAfter=No | Functor=9:PAT
12 ,          ,          PUNCT    Z:----- _                8 punct        8:punct
13 uvedl      uvést       VERB     VpYS----R-AAP-- Aspect=... 0 root         0:root         Functor=0:PRED
14 manažer    manažer     NOUN     NNMS1-----A---- Animacy... 13 nsubj       13:nsubj       Entity=(e62605--1-gstype:spec | Functor=13:RSTR
15 brazilského brazilský   ADJ      AAMS2-----1A---- Animacy... 16 amod       16:amod       Entity=(e62601--2-gstype:spec | Functor=16:RSTR
16 hráče      hráč        NOUN     NNMS2-----A---- Animacy... 14 nmod       14:nmod:gen   Entity=e62601 | Functor=14:APP
17 Ricardo    Ricardo     PROPN    NNMS1-----A---- Animacy... 14 flat       14:flat       Functor=14:RSTR
18 Fuica      Fuica       PROPN    NNMS1-----A---- Animacy... 14 flat       14:flat       Entity=e62605 | Functor=14:ACT | SpaceAfter=No
19 .          .          PUNCT    Z:----- _                13 punct      13:punct      _
```

- CorefUD 1.0 format
 - since CorefUD 1.0
 - fully compliant with the CoNLL-U format
 - may be included in UD releases
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```
# sent_id = ln94200-149-p2s3
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# orig_file_sentence ln94200_149#5
1 Pokud        pokud        SCONJ J,----- _                5 mark          5:mark          -
2 nebude      být          AUX      VB-S---3F-NAI-- Aspect=... 5 aux:pass      5:aux:pass      -
3 jeho        jeho        DET      P9XXXZS3----- Gender[... 4 det           4:det           Entity=(e62601--1-gstype:spec) | Functor=4:APP
4 smlouva     smlouva     NOUN     NNFS1-----A---- Case=No... 5 nsubj:pass    5:nsubj:pass    Functor=5:PAT
5 zrušena     zrušený     ADJ      VsQW----X-APP-- Aspect=... 8 advcl        8:advcl:pokud  SpaceAfter=No | LDeriv=zrušit | Functor=8:COND
6 ,          ,          PUNCT   Z:----- _                5 punct        5:punct        -
7 je         být          AUX      VB-S---3P-AAI-- Aspect=... 8 cop          8:cop          Functor=8:EFF
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8 rozhodnut  rozhodnutý  ADJ      VsYS----X-APP-- Aspect=... 13 ccomp        13:ccomp        LDeriv=rozhodnout | Functor=13:PAT
9 zanechat   zanechat   VERB     Vf-----A-P--  Aspect=... 8 xcomp        8:xcomp        Functor=8:MANN
10 vůbec     vůbec     PART     TT----- _                11 advmod:emph  11:advmod:emph  Functor=11:EXT
11 fotbalu   fotbal     NOUN     NNIS2-----A---- Animacy... 9 obl:arg      9:obl:arg:gen  SpaceAfter=No | Functor=9:PAT
12 ,        ,        PUNCT   Z:----- _                8 punct        8:punct        -
13 uvedl     uvést     VERB     VpYS----R-AAP-- Aspect=... 0 root         0:root         Functor=0:PRED
14 manažer   manažer   NOUN     NNMS1-----A---- Animacy... 13 nsubj        13:nsubj        Entity=(e62605--1-gstype:spec) | Functor=13:RSTR
15 brazilského brazilský  ADJ      AAMS2-----1A---- Animacy... 16 amod        16:amod        Entity=(e62601--2-gstype:spec) | Functor=16:RSTR
16 hráče     hráč     NOUN     NNMS2-----A---- Animacy... 14 nmod        14:nmod:gen    Entity=e62601 | Functor=14:APP
17 Ricardo   Ricardo   PROPN    NNMS1-----A---- Animacy... 14 flat        14:flat        Functor=14:RSTR
18 Fuica     Fuica     PROPN    NNMS1-----A---- Animacy... 14 flat        14:flat        Entity=e62605 | Functor=14:ACT | SpaceAfter=No
19 .        .        PUNCT   Z:----- _                13 punct       13:punct       -
```

- Udapi (Popel et al., 2017)
 - toolkit for text and UD data manipulation
 - querying, statistics
 - format conversions
 - visualization
- coreference object model
 - mention
 - entity
 - bridging links

```
#!/usr/bin/env python3
import udapi

# Extract the words of the first sentence in the Spanish blind dev set.
doc = udapi.Document("es_ancora-corefud-dev.conllu")
trees = list(doc.trees)
words = trees[0].descendants
print([w.form for w in words])
#['Los', 'jugadores', 'de', 'el', 'Espanyol', 'aseguraron', 'hoy', 'que',
# 'prefieren', 'enfrentar', 'se', 'a', 'el', 'Barcelona', 'en', 'la', 'final',
# 'de', 'la', 'Copa', 'de', 'el', 'Rey', 'en', 'lugar', 'de', 'en', 'las',
# 'semifinales', ',', 'tras', 'clasificar', 'se', 'ayer', 'ambos', 'equipos',
# 'catalanes', 'para', 'esta', 'ronda', '.']

# Create entity e1 with two mentions: "las semifinales" and "esta ronda"
e1 = doc.create_coref_entity()
e1.create_mention(words=words[27:29], head=words[28])
e1.create_mention(words=words[38:40], head=words[39])

# Create an empty node (zero) before the 9th word "prefieren".
zero = words[8].create_empty_child(deprel="nsubj", after=False, form="_")

# Make sure the input file es_ancora-corefud-dev.conllu is really
# the blind dev set without any empty nodes.
assert zero == trees[0].descendants_and_empty[8], "unexpected input file"

# Create entity e2 with two mentions:
# "Los jugadores de el Espanyol" and the newly created zero.
e2 = doc.create_coref_entity()
e2.create_mention(words=words[0:5], head=words[1])
e2.create_mention(words=[zero], head=zero)

# Print the newly created coreference entities.
udapi.create_block("corefud.PrintEntities").process_document(doc)

# Save the predictions into a CoNLL-U file
doc.store_conllu("output.conllu")
```

Visualization

Be it known then, that **Sir Walter**, like **a good father**, (having met with one or two private disappointments in very unreasonable applications), prided **himself** on remaining single for **his dear daughters'** sake.

For **one daughter**, **his eldest**, **he** would really have given up any thing, which **he** had not been very much tempted to do.

Elizabeth had succeeded, at sixteen, to all that was possible, of **her mother's** rights and consequence; and being very handsome, and very like **himself**, **her** influence had always been great, and **they** had gone on together most happily.

His two other children were of very inferior value.

Mary had acquired a little artificial importance, by becoming **Mrs Charles Musgrove**; but **Anne**, with an elegance of mind and sweetness of character, which must have placed **her** high with **any people of real understanding**, was **nobody** with either **father** or **sister**; **her** word had no weight, **her** convenience was always to give way--**she** was only **Anne**.

Visualization

Prof. Dr. Semih Koray'ın, dergimizde **bizim** ki eski yazılarından **onun** derlenerek kaleme alınan makalesini **onun** dosyamızın **bizim** sunuş yazısı **onun** yaptık **biz**.

Koray, **bilim etkinliğinin** **onun** **tarih** içinde **onun** ki serüvenini **onun** geleceğe de uzanarak analiz ederken **o** dosyamıza **bizim** güzel bir giriş de yapıyor **o**.

Dosyamız **bizim** esas olarak **iki bölümden** oluşuyor **o**.

1592년 (선조 25년) **임진왜란** 일어나자 **세자** (世子)로 책봉되었고, **함경도와 전라도** 등지에서 **군수품과** 의병을 직접 모집하고 **군량미를** 모으는 데에도 힘썼다.

임진왜란 동안 **세자의** 몸으로 **부왕을** 돕고 **전쟁** 승리에 적지 않은 공을 세웠으나, **부왕의** 인정과 칭찬은 커녕 견제와 냉대를 당해야만 했다.

1 תמצא ריעה בת לאה אשר ילדה ל יעקב ל ראות ב בנות ה ארץ :

1 ירא אה ה שקם בן תמור ה חיי נשיא ה ארץ ו ירח אה ה ו ישב אה ה ו עג ה :

1 תדבק נפש ו ב ריעה פח יעקב ו אההל את ה פער ו דבר על לב ה פער :

1 לאמר שקם אל תמור אבי ו לאמר קח ל ו את ה ילדה ה אתה ל אשה :

1 יעקב שמע כי טמא את ריעה בה ו בגי ו היו את מקנן הו ב ה שנה ו הסגש יעקב עד בא :

Adding new datasets

- only datasets with free licenses
 - Chinese and Arabic OntoNotes
- datasets enhancing diversity preferred
 - language
 - non-European (e.g. Korean, Hindi)
 - ancient (Ancient Greek, Ancient Hebrew, Old Church Slavonic)
 - domain
 - LitBank: English but fiction, longer contexts
 - Ancor: French but spoken

Adding new datasets

- implementing the conversion pipeline
 - by the core team members
 - majority of datasets
 - time-consuming
 - cooperation of the core team with external volunteers
 - outsourcing it with no or weak supervision
 - initialize and outsource
 - ideally by the authors of the datasets
 - to promote their dataset

Design decisions

- mention
 - no ID
 - full span specified
 - may be discontinuous
- mention head
 - determined from the dependency tree
 - using the Udapi block `corefud.MoveHead`
- coreference entities / clusters
 - grouping by co-indexing (not by links)
 - singletons allowed
- zero mentions
 - represented by empty nodes using enhanced UD graphs
 - empty nodes may have multiple parents
- bridging relations
 - cluster-to-cluster
 - mention-to-mention would require mention IDs
- morphology and syntax
 - UD-based
 - gold if easy to convert
 - otherwise using UDPipe 2

CorefUD vs. Universal Anaphora

CRAC Shared Tasks

Coreference Resolution systems

evaluated
only on
English
OntoNotes
(and GAP in
some cases)

Paper	Model	\emptyset /ELMo/ base PLM	large PLM ~350M	xl PLM ~3B	xxl PLM ~11B	NN calls
Lee et al. (2017)	e2e	67.2 \emptyset				1
Lee et al. (2018)	e2e	70.4 _{ELMo}				1
Lee et al. (2018)	c2f	73.0 _{ELMo}				1
Joshi et al. (2019)	c2f	73.9 _{BERT}	76.9 _{BERT}			1
Joshi et al. (2020)	c2f		79.6 _{SpanB}			1
Kirstain et al. (2021)	s2e		80.3 _{Longf}			1
Otmazgin et al. (2023)	LingMess/s2e		81.4 _{Longf}			1
Dobrovolskii (2021)	WL		81.0 _{RoBE}			1
D'Oosterlinck et al. (2023)	CAW/WL		81.6 _{RoBE}			1
Liu et al. (2022)	ASP	76.6 _{T5}	79.3 _{T5}	82.2 _{FT5}	82.5 _{FT5}	$\mathcal{O}(n)$
Bohnet et al. (2023)	seq2seq			78.0 _{mT5} ^{dev}	83.3 _{mT5}	$\mathcal{O}(n)$
Wu et al. (2020)	CorefQA	79.9 _{SpanB} ^{+QA}	83.1 _{SpanB} ^{+QA}			$\mathcal{O}(n)$
Straka (2023)	CorPipe		80.7 _{T5}	82.0 _{FT5}		1
Straka (2023)	CorPipe		77.2 _{mT5}	78.9 _{mT5}		1

from Straka (2023)

Shared task in general

- collaborative evaluation campaign organized within the research community
 - popular in the fields such as Natural Language Processing, Machine Learning
- provides a common problem, shared dataset and evaluation framework so that multiple teams can develop and compare their systems under the same conditions
- purposes:
 - to encourage research progress on a specific task
 - to increase reproducibility and comparability of the methods
 - to provide benchmark datasets, evaluation tools and baseline models
- examples:
 - CoNLL Shared Tasks
 - SemEval
 - WMT

Shared task details

- CRAC Shared Task on Multilingual Coreference Resolution
 - collocated with the Workshop on Computational Models of Reference, Anaphora and Coreference (CRAC)
 - based on CorefUD

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- task
 - identify mentions in texts and predict which mentions belong to the same coref. cluster

Shared task	Languages	Zeros
SemEval 2010 <small>(Recasens et al., 2010)</small>	7	not stated
CoNLL 2012 <small>(Pradhan et al., 2012)</small>	3	removed

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CRAC 2022 (Žabokrtský et al., 2022)	10	included (pre-defined slots)
CRAC 2023 (Žabokrtský et al., 2023)	12	included (pre-defined slots)

Shared task details

- CRAC Shared Task on Multilingual Coreference Resolution
 - collocated with the Workshop on Computational Models of Reference, Anaphora and Coreference (CRAC)
 - based on CorefUD
- task
 - predict empty nodes
 - identify mentions in texts and predict which mentions belong to the same coref. cluster

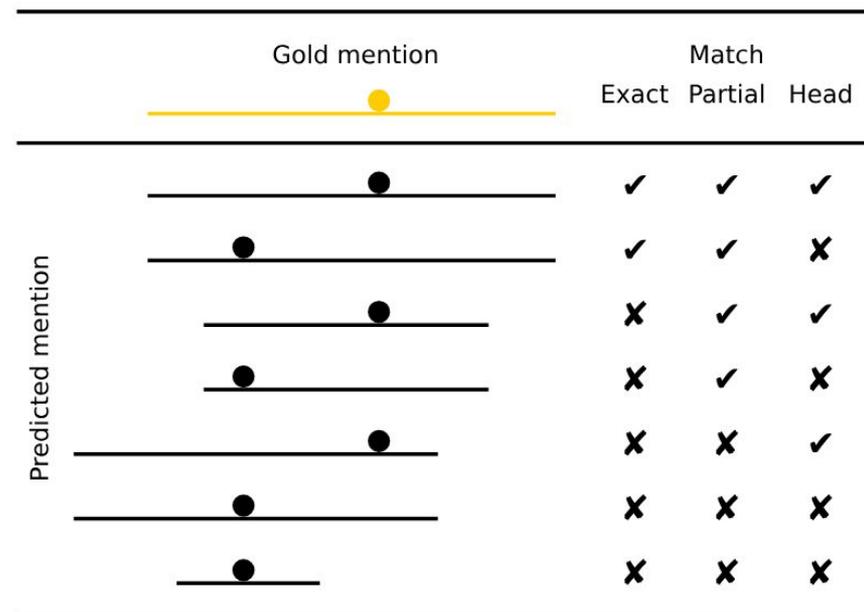
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CRAC 2024 (Novák et al., 2024)	15	included
CRAC 2025 (Novák et al., 2025)	17	included

- scoring is complex
 - comparing clusters of mentions
 - MUC (Vilain et al., 1995), B3 (Bagga and Baldwin, 1998), CEAF-e, CEAF-m (Luo, 2005), BLANC (Recasens and Hovy, 2011), LEA (Moosavi and Strube, 2016)
 - each one has P/R/F1

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 - each one has P/R/**F1**
 - CoNLL F1 score
 - **average**
 - macro-averaged over all datasets

Evaluation

- scoring is complex
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 - each one has P/R/F1
 - CoNLL F1 score
 - **average**
 - macro-averaged over all datasets
- gold and predicted mentions must be matched
 - exact match: used traditionally for English
 - partial match: CRAC'22
 - head match: since CRAC'23



- zero matching
 - no special treatment until CRAC 2024
 - all empty nodes were already reconstructed in the input
 - predicted empty nodes no longer guaranteed to align 1:1 with the gold empty nodes
 - dependency-based matching
 - priority to the accurate assignment of both parents and dep. types, but parents are enough

1 ●

2 ●

3 ●

4 ●

5 ●

6 ●

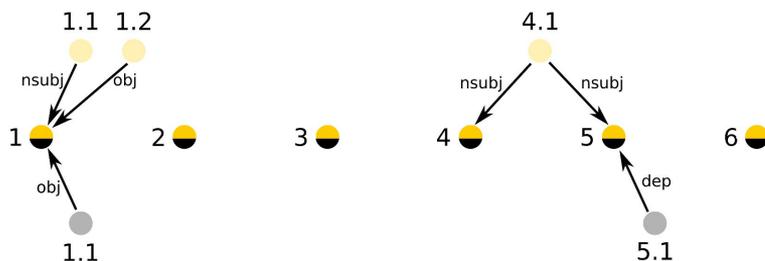
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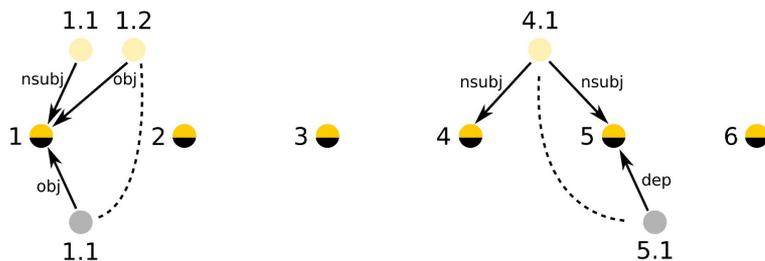
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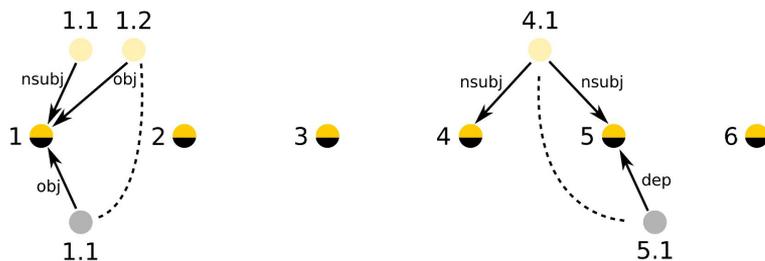
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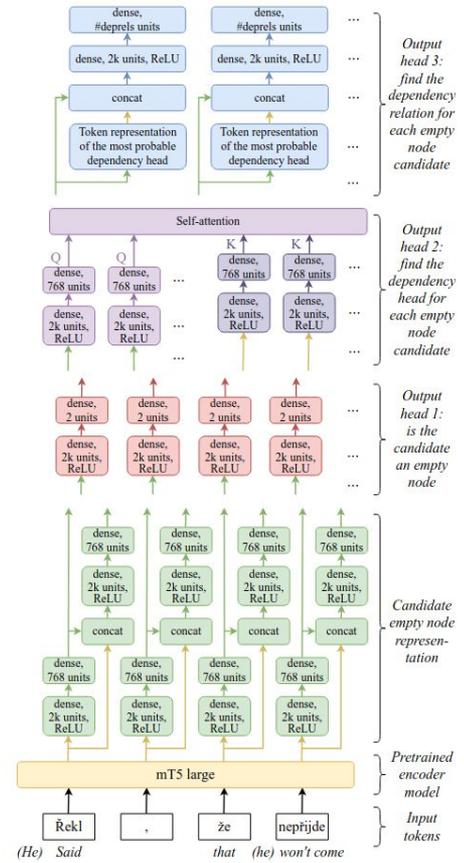


- mention-decomposable score for zeros

- difficult to compute traditional scores only on a specific type of mentions
- allows it but due to oversimplification may lead to inaccuracies

Baseline systems

- empty nodes prediction (by Milan Straka)
 - based on XLM-RoBERTa large (Conneau et al., 2020)
 - two empty-node candidates for each word
 - its representation processed by three prediction heads:
 - empty node
 - word order
 - dependency relation
 - trained on a combination of all CorefUD datasets with zeros
 - macro-avg F1 = 82.9 (CRAC'24)
- coreference resolution (by Ondřej Pražák)
 - same each year
 - based on the system by (Pražák et al., 2021), originally proposed by (Lee et al., 2018)
 - built on multi-lingual BERT
 - same system for all languages



from Straka (2024)

Public

- Ancient Greek-PROIEL (Haug and Jøhndal, 2008)
- Ancient Hebrew-PTNK (Swanson et al., 2024)
- Catalan-AnCora (Recasens and Martí, 2010)
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- German-PotsdamCC (Bourgonje and Stede, 2020)

Non-public

- Dutch-COREA (Hendrickx et al., 2008)
- English-ARRAU (Uryupina et al., 2020)

CorefUD 1.3

- Hindi-HDTB (Mujadia et al., 2016)
 - Hungarian-KorKor (Vadász, 2022)
 - Hungarian-SzegedKoref (Vincze et al., 2018)
 - Korean-ECMT (Nam et al., 2020)
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-
- English-OntoNotes (Weischedel et al., 2011)
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Shared Task Data: content differences

- non-public datasets excluded
- ParCorFull excluded in 2025
 - the smallest dataset
 - the largest variance across training runs

Shared Task Data: content differences

Public

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CRAC'25 Shared Task Data

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Shared Task Data: annotation differences

Data type	Starting point	Empty nodes	Coreference	Morpho-syntax	Forms of empty nodes
Gold (train / dev)	All	manual	manual	original (manual if available, otherwise automatic)	deleted
Input (dev / test)	Coref. and zeros from scratch	deleted	deleted	automatic UDPipe 2	deleted
	Coref. from scratch	automatic baseline	deleted	automatic UDPipe 2	deleted
	Refine the baseline	automatic baseline	automatic baseline	automatic UDPipe 2	deleted

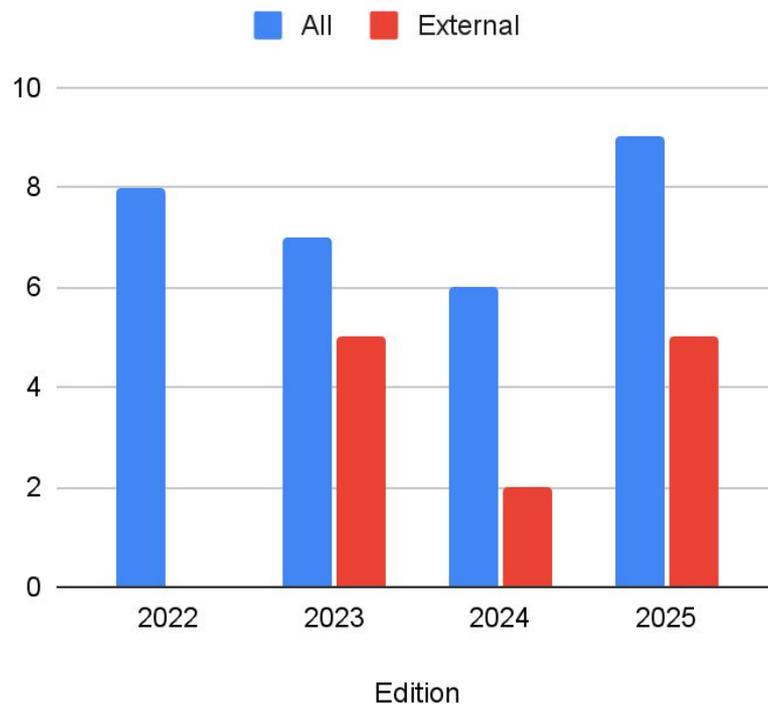
Participants

- advertising
 - among colleagues and our students
 - ACL Portal mailing list
 - direct emails to authors of coreference-related papers (by Anja Nedoluzhko)

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 - direct emails to authors of coref-related papers (by Anja Nedoluzhko)
 - personally at conferences

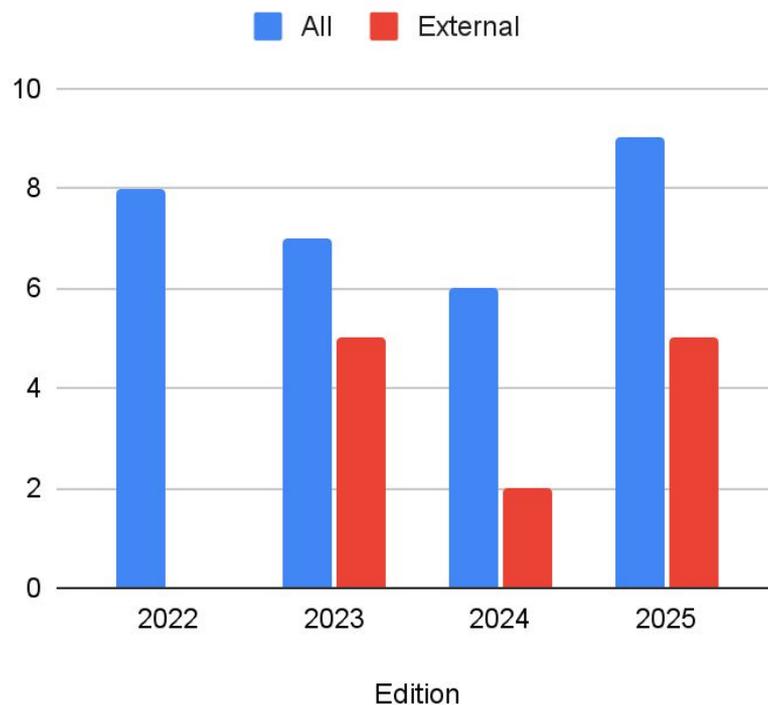
Submissions



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 - personally at conferences
- not easy to attract
 - CR shifted to the fringes?
 - only workshop?
 - our organization and dissemination mistakes?

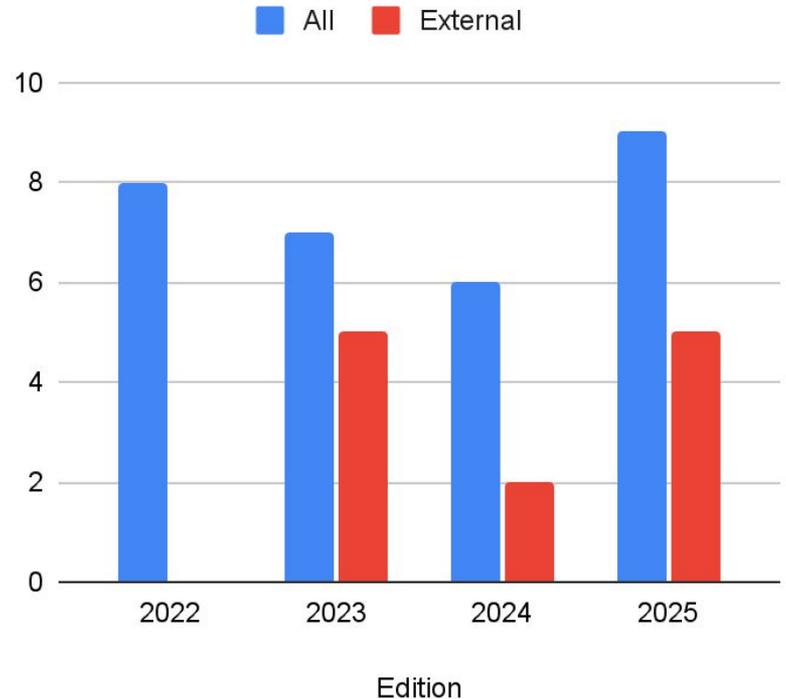
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 - CR shifted to the fringes?
 - only workshop?
 - our organization and dissemination mistakes?
- still thankful to all the participants
 - Milan Straka (the winner of each edition)
 - Natalia Skachkova from DFKI
 - Ondřej Pražák from UWB

Submissions



Multilingual CR Performance

- winner's CoNLL F1

Multilingual CR Performance

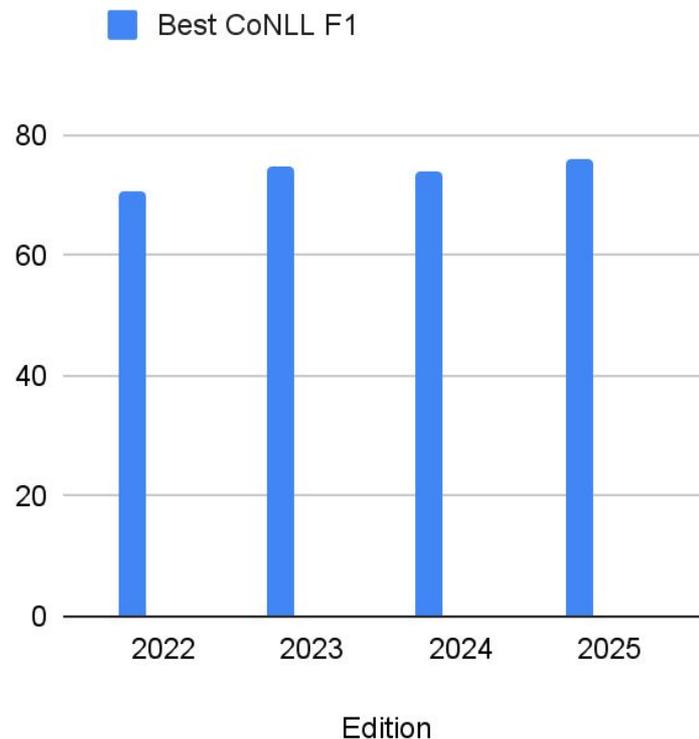
- winner's CoNLL F1

CorPipe system
by Milan Straka

Multilingual CR Performance

- winner's CoNLL F1
 - around 70-75
 - changes in data and evaluation setup across years
 - not directly comparable

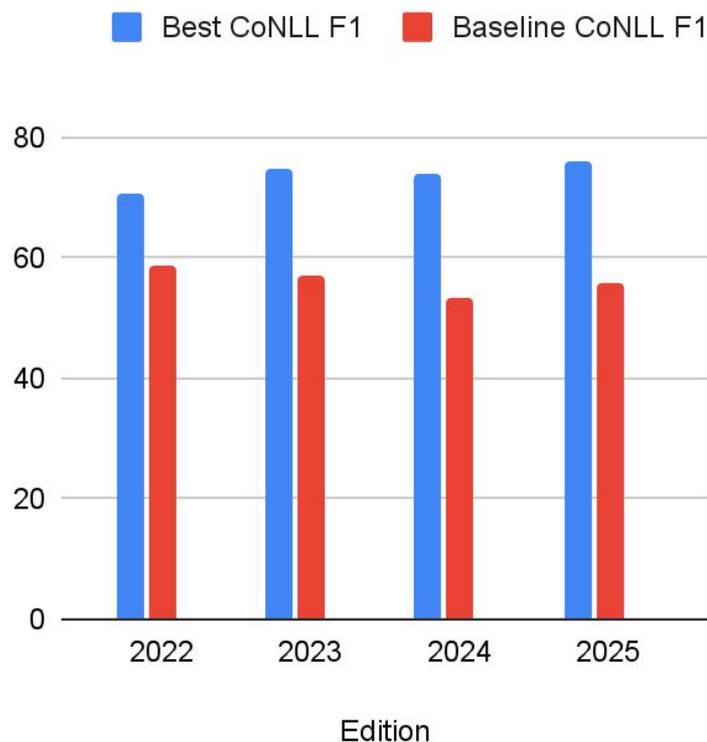
Performance



Multilingual CR Performance

- winner's CoNLL F1
 - around 70-75
 - changes in data and evaluation setup across years
 - not directly comparable
- baseline
 - still the same system, just retrained
 - the task gets more difficult

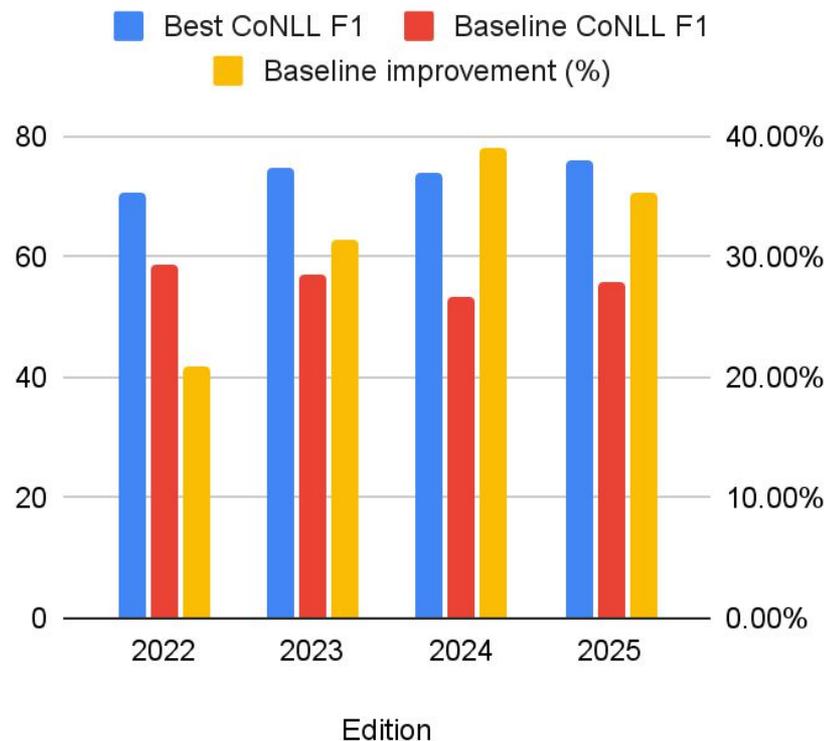
Performance



Multilingual CR Performance

- winner's CoNLL F1
 - around 70-75
 - changes in data and evaluation setup across years
 - not directly comparable
- baseline
 - still the same system, just retrained
 - the task gets more difficult
- improvement of the winner over the baseline (%)
 - fair comparison
 - +10% / year
 - 2025: decrease caused by removal of ParCorFull from the shared task data

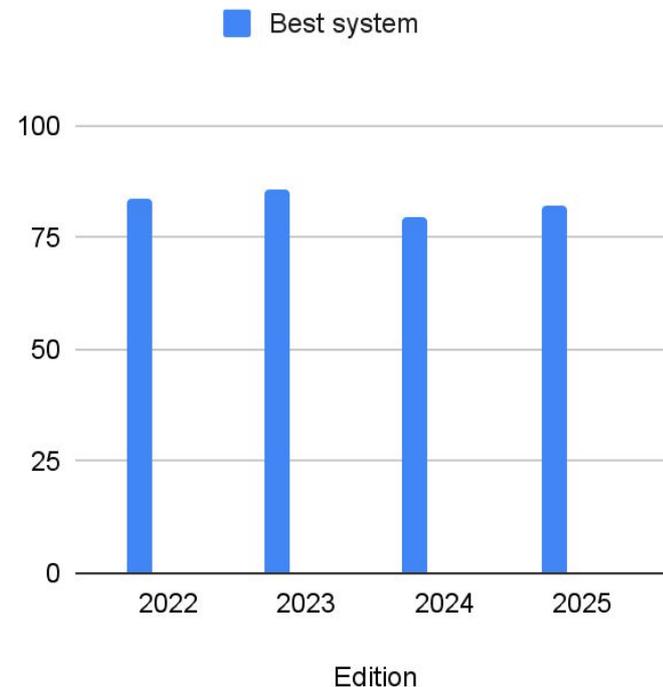
Performance



Performance on zeros

- mention-decomposable score for zeros
 - averaged over all datasets with zeros (2022: 5, 2023: 6, 2024-25: 10)
- moving to more realistic setup
 - 2024
 - drop in absolute performance

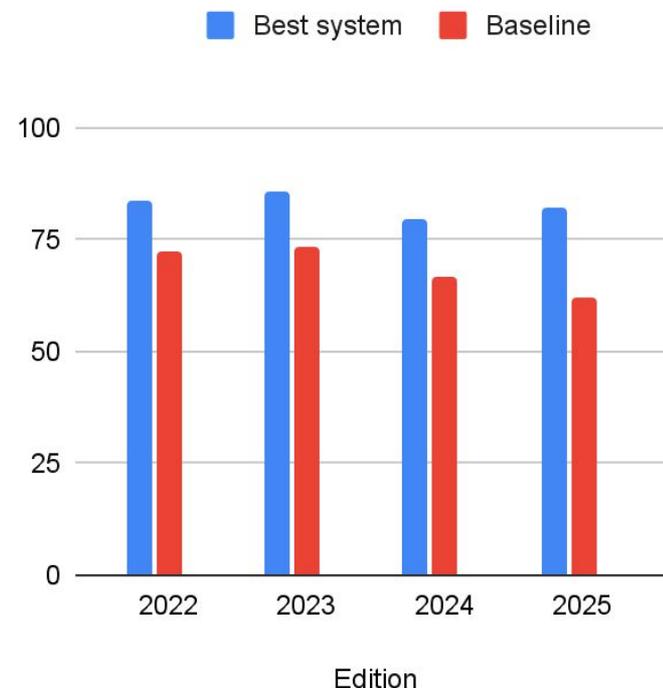
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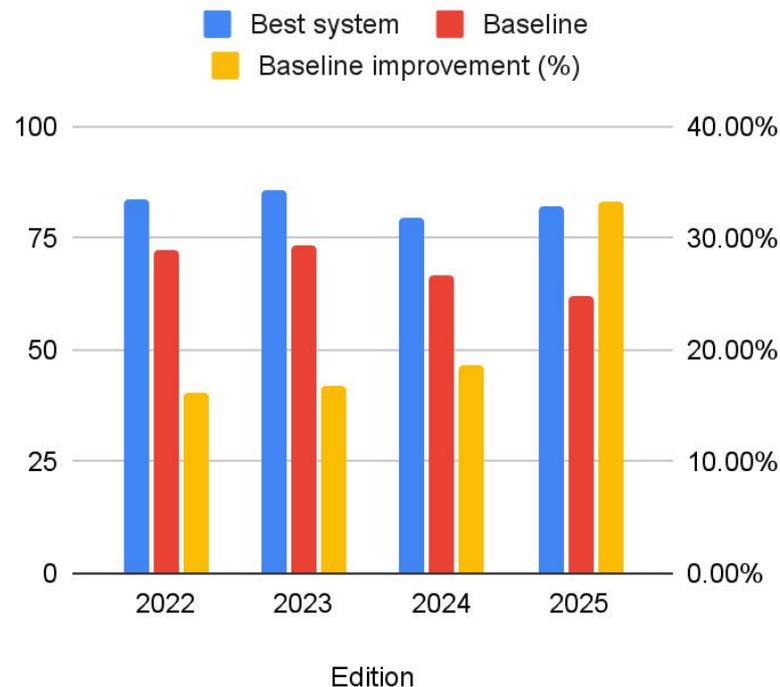
Performance on zeros



Performance on zeros

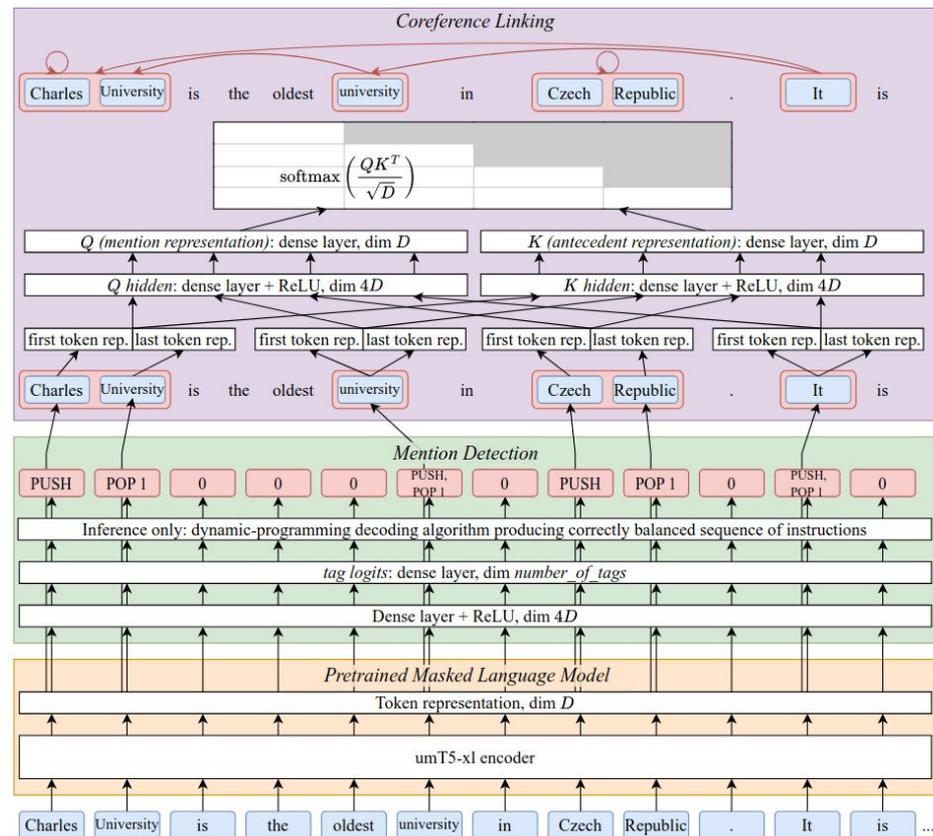
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- moving to more realistic setup
 - 2024
 - drop in absolute performance
- improvement of the winner over the baseline
 - 2025: large drops in baseline performance on Czech data

Performance on zeros



Traditional approach to CR

- CorPipe by Milan Straka
- built on top of encoder-based language models
- neural architecture on top generating the annotation



LLMs for Coreference

LLMs for CR

- using LLMs for coreference resolution
 - LLMs are decoder-based models generating text
- previous attempts (Gan et al., 2024, Hicke and Mimno, 2024, Le and Ritter, 2023, Saputa et al., 2024, Vadász, 2023)
 - failed to reach state-of-the-art performance
 - not tested in highly multilingual setup
 - ignoring zeros

LLM track in CRAC'25 Shared Task

- two tracks in CRAC'25 Shared task
 - LLM Track
 - LLM-based submissions
 - plaintext format with zeros (empty nodes) support
 - import/export tools
 - Unconstrained Track
 - for traditional approaches
 - same setup as in 2024
 - baseline systems provided

Data modifications due to the LLM Track

- dev and test sets capped to 25k words
 - to lower the computational cost of evaluation
 - half of the original size but affecting only a few datasets
 - variance across training runs increased only marginally

Data modifications due to the LLM Track

Public

- Ancient Greek-PROIEL (Haug and Jøhndal, 2008)
- Ancient Hebrew-PTNK (Swanson et al., 2024)
- **Catalan-AnCora** (Recasens and Martí, 2010)
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Non-public

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CRAC'25 Shared Task Data, **capped**

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Data modifications due to the LLM Track

- plaintext format
 - mention bracketing
 - with support for zeros
 - CoNLL-U still needed for evaluation
 - import / export script available

Spanish:

El conductor del tren vio el coche en la vía e intentó frenar.

English transl.:

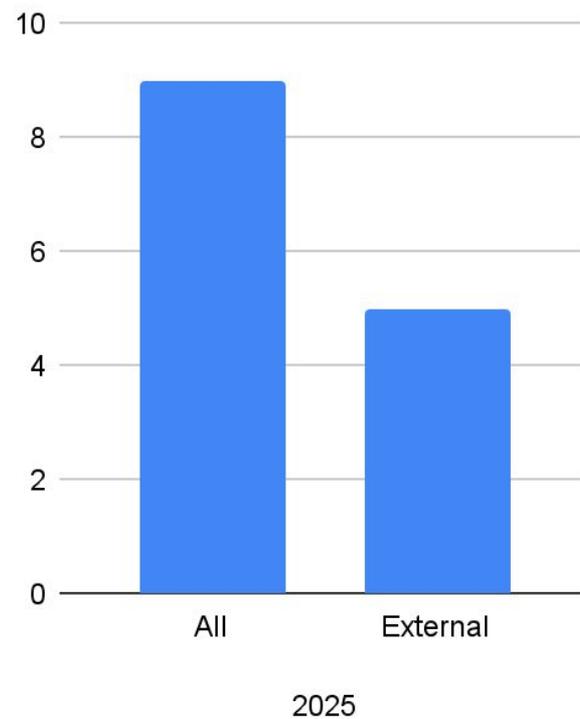
The driver of-the train saw the car on the track and tried to brake.

Our serialization:

E1 | [e22 conductor de el tren | [e5], e22] vio e1 | [e7 coche | e7]
en la | [e8 vía | e8] e intentó ## | [e22] frenar | [e23] .

Participants across tracks

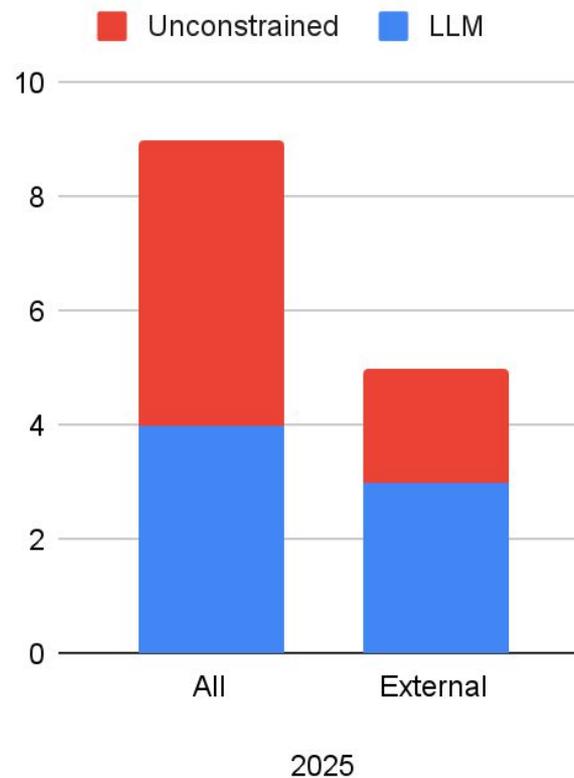
Participants



Participants across tracks

- half and half
- external participants slightly preferred the LLM track

Participants



Systems in the LLM track

Name	Techniques	Model	Input ctx. len.	#Params
LLM-UWB	FT, LoRA, QLoRA, quant.	Llama-3.1-8B	8,192	8 B
LLM-PUXCRAC2025	few-shot, re-rank	Gemini-Flash-2.0 Grok-3	1,048,576	—
LLM-GLaRef-CRAC25	FT, prompt-tune, QLoRA, quant.	gemma-3-12b-it	—	12 B
LLM-NUST-FewShot	few-shot in-context	Gemini 2.5 Pro	300,000	—
CorPipeSingle	FT multistage	umT5-xl	512/2,560	1.7 B
CorPipeEnsemble	FT + ensemble	umT5-xl	512/2,560	8.6 B

- based on both closed-source and open-source models
- approaches:
 - few-shot prompting
 - QLoRA fine-tuning
- able to process much longer contexts at once
- models are bigger

Systems in the LLM track: performance

- within the LLM track:
comparable performance

System	CoNLL F1
LLM-GLaRef-CRAC25	62.96
LLM-NUST-FewShot	61.74
LLM-PUXCRAC2025	60.09
LLM-UWB	59.84

Systems in the LLM track: performance

- within the LLM track:
comparable performance
- outperforming baseline

System	CoNLL F1
LLM-GLaRef-CRAC25	62.96
LLM-NUST-FewShot	61.74
LLM-PUXCRAC2025	60.09
LLM-UWB	59.84
BASELINE	56.01

Systems in the LLM track: performance

- within the LLM track:
comparable performance
- outperforming baseline
- much worse than the
best-performing traditional
systems

System	CoNLL F1
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LLM-NUST-FewShot	61.74
LLM-PUXCRAC2025	60.09
LLM-UWB	59.84
CorPipeEnsemble	75.84
CorPipeSingle	74.75
BASELINE	56.01

Systems in the LLM track: performance

- within the LLM track:
comparable performance
- outperforming baseline
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systems

#	User	Entries	Date of Last Entry	avg ▲
1	hejmanj	4	07/29/25	70.03 (1)
2	oseminck	17	06/27/25	62.96 (2)
3	moizsajid	6	06/27/25	61.74 (3)
4	PuxAl	14	06/27/25	60.09 (4)

System	CoNLL F1
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Conclusion

Conclusion

- CorefUD collection and CRAC Shared Tasks
 - standardizing multilingual coreference data
 - standardizing evaluation framework
 - turning attention to some more challenging aspects of coreference resolution, e.g. zeros
- LLMs for coreference resolution
 - encouraging experiments and research in this direction

Future Work

- CRAC 2026 Shared Task
 - will LLMs dethrone traditional approaches?
 - LLMs should be better in long-document coreference resolution
 - preparation period shortened by 4 months
- LLM-driven annotation guideline harmonization
 - with Anja Nedoluzhko and Katja Lapshinova-Koltunski

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Summary

- standardizing multilingual coreference data
- standardizing evaluation framework
- turning attention to some more challenging aspects of coreference resolution
- encouraging research on using LLMs for coreference resolution

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<https://ufal.cz/corefud/crac25>