

Exploring Neural Methods for Parsing Discourse Representation Structures

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Main Goal

Neural model that is able to produce DRSs

Discourse Representation Structures

I am not working for Tom

PMB release 2.1.0
pmb.let.rug.nl

$e_1 \ x_1 \ t_1$
time.n.08(t_1)
$t_1 = \text{now}$
work.v.02(e_1)
Time(e_1, t_1)
Co-Agent(e_1, x_1)
Agent(e_1 , speaker)
male.n.02(x_1)
Name(x_1 , tom)

	Data	Docs	Tokens
Train	3,998	24,917	
Test	557	3,180	
Train	73,778	638,610	

Fully manually annotated
 Partially manually annotated

Gold standard

b1 REF t1
b1 EQU t1 "now"
b1 time "n.08" t1
b2 Time e1 t1
b1 NOT b2
b2 REF e1
b2 Agent e1 "speaker"
b2 work "v.02" e1
b2 Co-Agent e1 x1
b3 REF x1
b3 Name x1 "tom"
b3 male "n.02" x1

System output

b2 REF x1
b2 EQU x1 "now"
b2 time "n.08" x1
b1 Time x2 x1
b2 NOT b1
b1 REF x2
b1 Agent x2 "speaker"
b1 work "v.01" x2
b1 REF x3
b1 Goal x2 x3
b1 Name x1 "tom"

Var matching

b1 → b2
t1 → x1
b2 → b1
e1 → x2

P: 5/8
R: 5/9
F: 58.8

Variables

Rewrite variables based on De Bruijn index

\$NEW REF @NEW	\$0 Agent @0 "speaker"
\$0 EQU @0 "now"	\$0 work "v.02" @0
\$0 time "n.08" @0	\$0 Co-Agent @0 @1
\$NEW Time @1 @0	\$NEW REF @NEW
\$-1 NOT \$0	\$0 Name @0 "tom"
\$0 REF @NEW	\$0 male "n.02" @0

Characters or Words?

Characters! But keep:

- DRS operators: NOT, REF, EQU
- DRS roles : Agent, Time, Theme
- DRS variables: \$NEW, @1, \$0, @-1

Outperformed:
Words (Glove)
BPE
Char + words
Next: BERT/XLNet

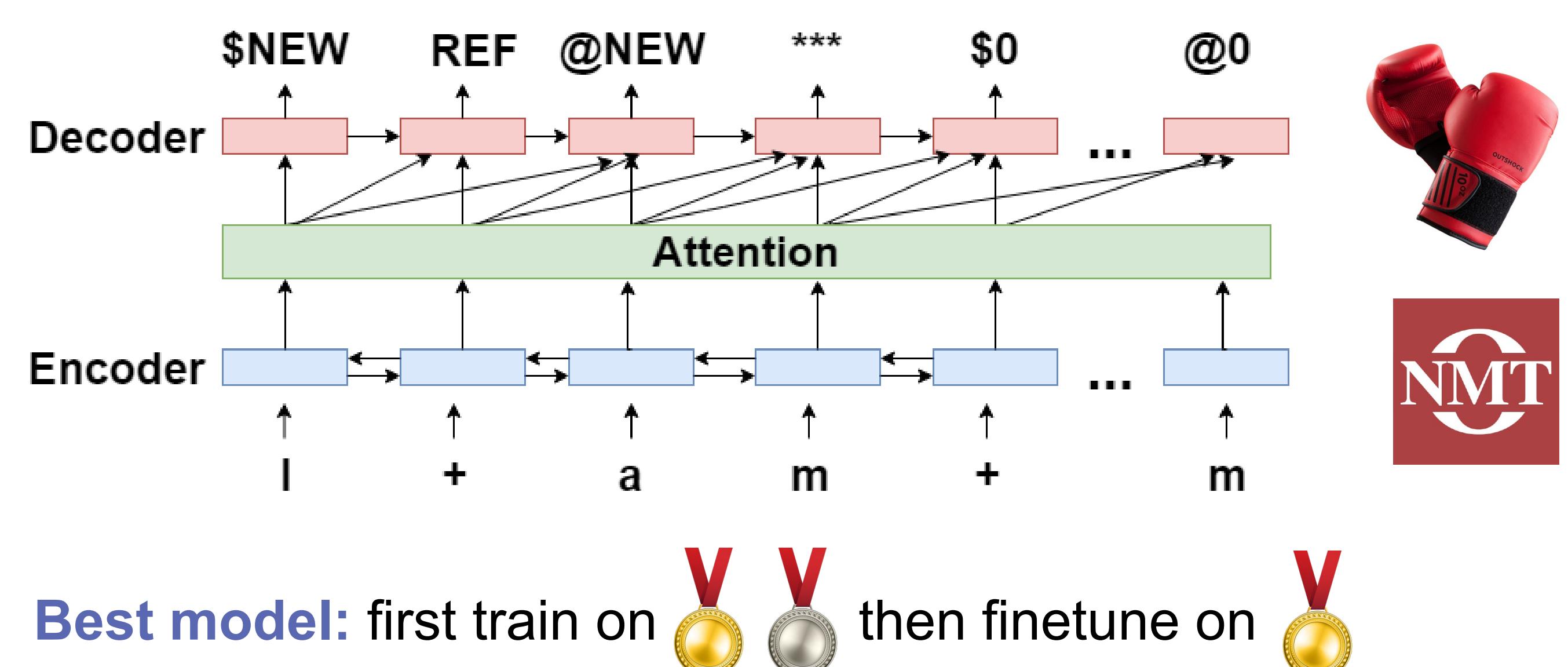
Sentence:

I + a m + not + w o r k i n g + f o r + T o m

DRS:

\$NEW REF @NEW *** \$0 EQU @0 "now" *** \$0 time
"n.08" @0 *** \$NEW Time @1 @0 *** \$-1 NOT \$0 [...]

Neural Model



Best model: first train on then finetune on

DRS Referee

A list of clauses is not necessarily a well-formed DRS!

- Well-formed syntax
- No free variables
- No loops in relations
- Single main box



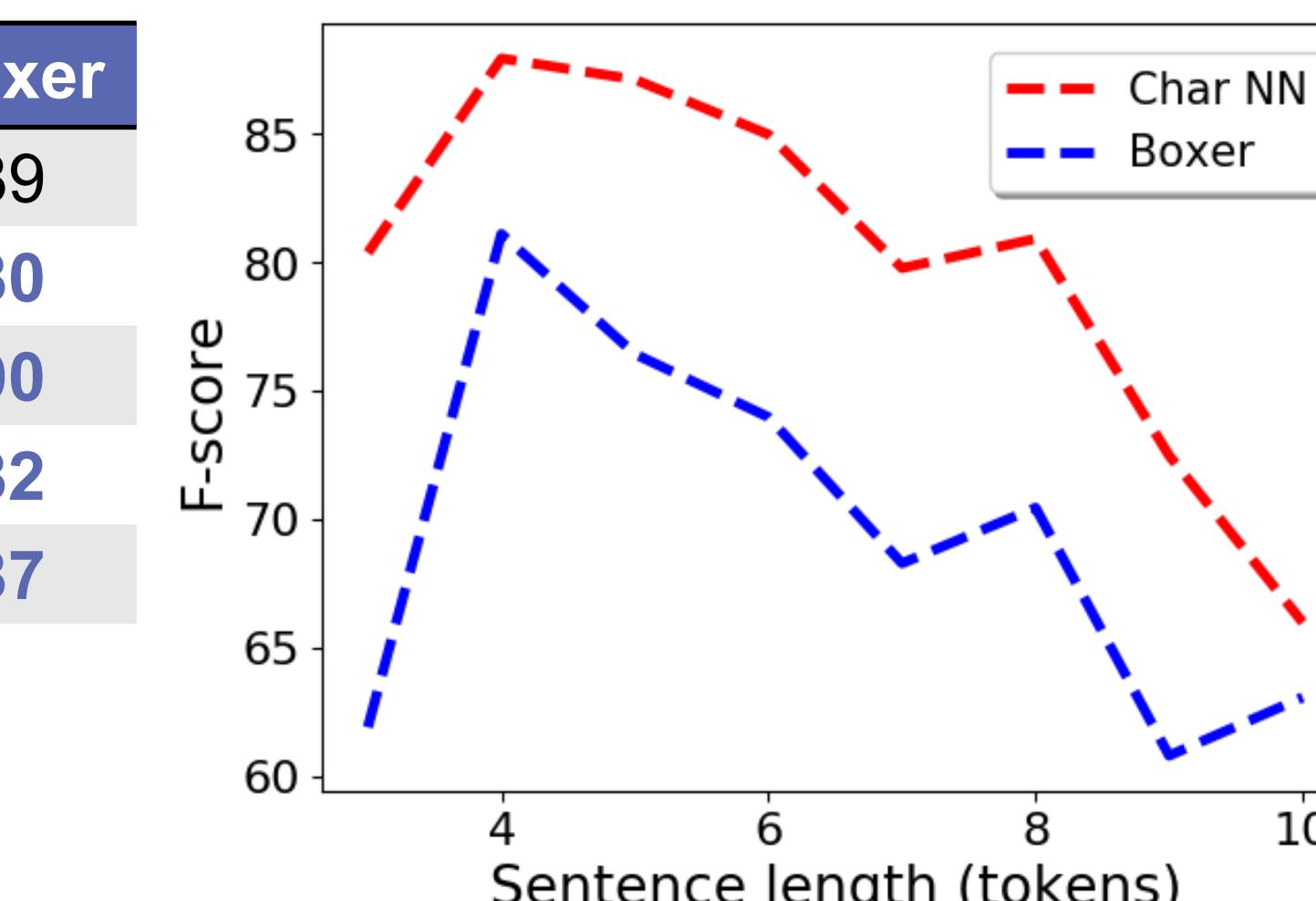
F-score of 0.0 for ill-formed DRSs

Results

Model	Prec	Rec	F	NN	Boxer
SPAR	48.0	33.9	39.7	All clauses	83.6 74.3
Sim-SPAR	55.6	57.9	56.8	DRS Operators	93.2 88.0
amr2drs	43.3	43.0	43.2	Roles	84.1 71.4
Boxer	75.7	72.9	74.3	Concepts	79.7 72.5
This work - gold only	79.7	76.2	77.9		
This work – gold + silver	84.7	82.4	83.6		

But what about semantics?

Phenomenon	#	NN	Boxer
Negation & modals	73	90	89
Scope ambiguity	15	73	80
Pronoun resolution	31	84	90
Discourse rel. & imp.	33	64	82
Embedded clauses	30	77	87

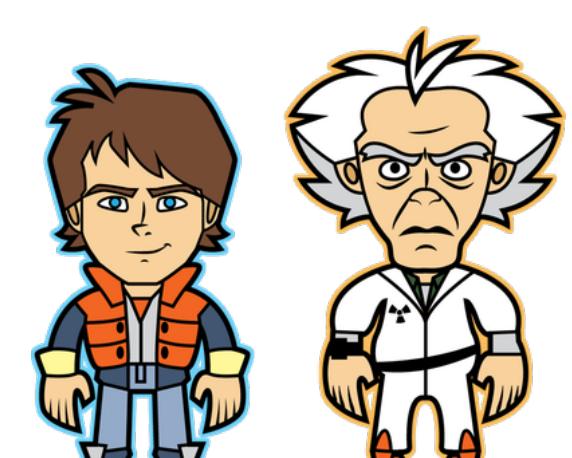


A look into the future...

Linguistic features can improve performance

Separately encode: POS, DEP, SYM, CCG, SEM

Linguistic Information in Neural Semantic Parsing Using Multiple Encoders
Van Noord, Toral and Bos, IWCS 2019



Check out the proceedings of our shared task!

Transformers, stack-LSTMs and much more...

DRS parsing
$x \ y$
$\text{parse.v.01}(y)$
$\text{Result}(y, x)$
$\text{drs.n.01}(x)$

The First Shared Task on Discourse Representation Structure Parsing
Abzianidze, Van Noord, Haagsma and Bos, IWCS 2019 pmb.let.rug.nl/shared_task.php