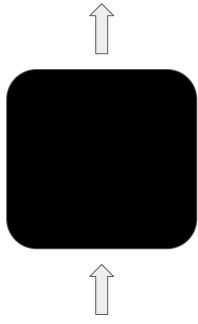
Improving Neural Machine Translation

Mateusz Krubiński





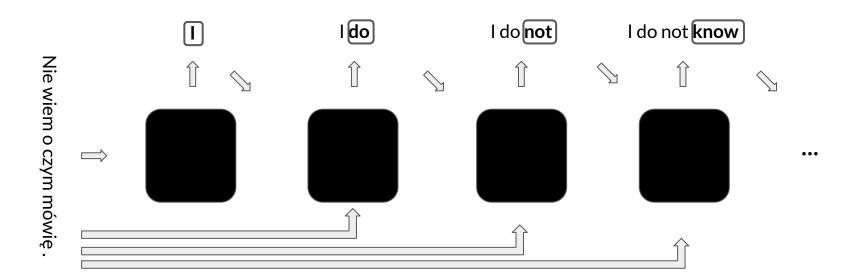
I do not know what I am talking about.



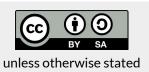
Nie wiem o czym mówię.











Training data - Parallel corpus

Zjadłem dziś pyszny obiad.	I had a great dinner today.
Gdy jadę samochodem zapinam pasy.	When I drive a car I close my seat belt.
Mamy dziś piękną pogodę!	We have a great weather today!
Masz czas dziś wieczorem?	I don't like pasta with garlic.
My internet browser isn't working.	My internet browser isn't working.
03.05.1999	03.05.1999

• Depending on language pair, roughly 30k - 100M sentence pairs used for training





Evaluation

- Human evaluation
 - Linguist, according to some guideline
 - Does not require a reference translation
- Automatic evaluation
 - BLEU metric modified precision of n-grams
 - Requires a reference translation
 - o 0-100, the higher the better





	SOURCE	REFERENCE	MODEL OUTPUT	BLEU
#1		Duże zmiany w Uberze mają miejsce po wejściu na giełdę w maju i braku zysków od miesięcy .	Wielkie zmiany Ubera się jak firma walczy o obrót zysk miesięcy po tym , jak wszedł na giełdę w maju .	13.52
#2	Uber's big changes come as the company struggles to turn a profit months after it went public in May .		Duże zmiany w Uberze następują , gdy firma walczy o zysk kilka miesięcy po wejściu na giełdę w maju .	37.52
#3			Wielkie zmiany w Uber nastąpiły , gdy firma walczy o zwrot z zysku kilka miesięcy po tym , jak stała się publiczna w maju .	4.9





How do we improve the baseline?

- Add more parallel data.
- Train bigger model.





How do we improve the baseline?

- Add more parallel data.
- Train bigger model.
- But what if we are constrained to use only the data we are given?

EMNLP 2020 FIFTH CONFERENCE ON MACHINE TRANSLATION (WMT20)

November 19-20, 2020 Online

Home

- Given certain data, train THE BEST machine translation system.
- What is THE BEST? Performing best on test set, according to human judgment







Samsung R&D Institute Poland submission to WMT20 News Translation Task

Mateusz Krubiński, Marcin Chochowski, Bartłomiej Boczek,
Mikołaj Koszowski, Adam Dobrowolski,
Marcin Szymański, Paweł Przybysz
Samsung R&D Institute Poland

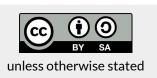




Corpus filtering

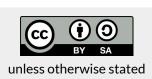
Zjadłem dziś pyszny obiad.	I had a great dinner today.	0.95
Gdy jadę samochodem <mark>zapinam</mark> pasy.	When I drive a car I <mark>close</mark> my seat belt.	0.75
Mamy dziś piękną pogodę!	We have a great weather today!	0.96
Masz czas dziś wieczorem?	I don't like pasta with garlic.	0.2
My internet browser isn't working.	My internet browser isn't working.	0.6
03.05.1999	03.05.1999	0.65





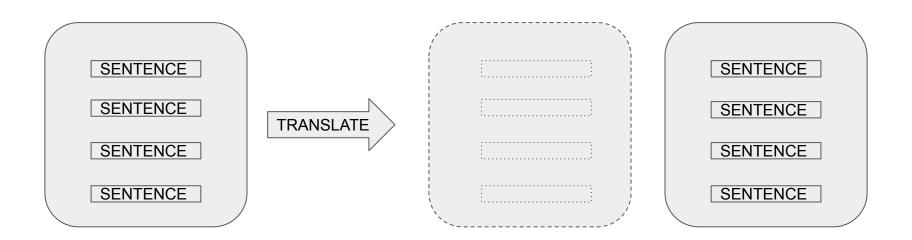
	Orig.	+ clean-up	+ fast-align
$En \leftrightarrow Cs$	62.5M	61.8M	43.4M
$En \leftrightarrow Iu \\$	2.6M	1.2M	1.1M
$En \leftrightarrow Pl$	11.2M	10.7M	8.6M



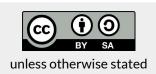


Back-translation

- Much more monolingual than parallel data how to use it?
- Translate it with the baseline system, use the artificial parallel corpus

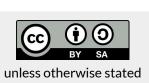




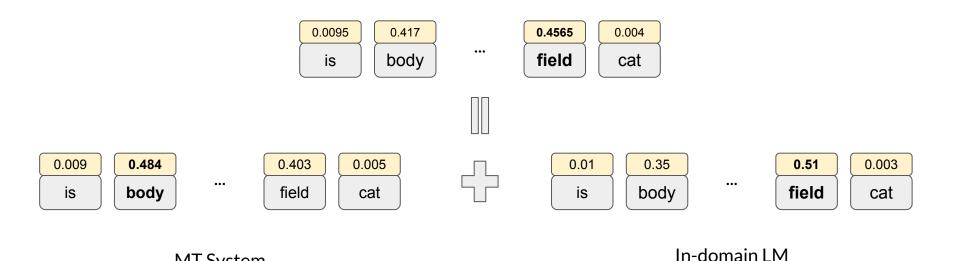


	newsdev2020	
System	$\mathbf{En} \to \mathbf{Cs}$	$\textbf{Cs} \rightarrow \textbf{En}$
Quadro-huge	26.0	32.7
+ finetune	26.5	33.5
+ ensemble	27.3	33.8
+BT	27.4	37.4





Ensembling with in-domain language model

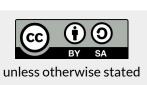


Ciało Galois to pierwsze o czym pomyślałem.

MT System







	newsdev2020	
System	$\mathbf{En} o \mathbf{Pl}$	$\textbf{Pl} \rightarrow \textbf{En}$
Quadro-huge	27.3	32.3
+ finetune	27.4	32.8
+ ensemble	28.7	32.9

Google Translate: "Galois's body was the first thing I thought about."





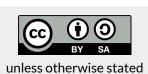
	- 011011	,
Ave.	Ave. z	System
77.2	0.131	SRPOL
76.7	0.097	Online-G
77.7	0.096	NICT-Rui
77.9	0.094	Online-B
78.1	0.085	SJTU-NICT
76.6	0.083	Online-A
75.2	0.050	OPPO
77.3	0.006	Online-Z
78.1	-0.003	CUNI-Transformer
76.1	-0.038	NICT-Kyoto
73.3	-0.041	VolcTrans
73.2	-0.048	PROMT-NMT
74.3	-0.072	Tilde
74.0	-0.130	zlabs-nlp

Polish \rightarrow **English**

English → Polish			
Ave. z	System		
0.672	HUMAN		
0.493	SRPOL		
0.435	eTranslation		
0.383	VolcTrans		
0.348	Tilde		
0.316	Online-G		
0.310	OPPO		
0.299	NICT-Kyoto		
0.272	Tilde		
0.255	CUNI-Transformer		
0.236	Online-B		
0.219	SJTU-NICT		
0.097	Online-A		
-0.060	Online-Z		
-0.538	zlabs-nlp		
	Ave. z 0.672 0.493 0.435 0.383 0.348 0.316 0.299 0.272 0.255 0.236 0.219 0.097 -0.060		

I	Inuktitut → English			
Ave.	Ave. z	System		
73.1	0.168	NiuTrans		
72.9	0.167	Facebook-AI		
71.2	0.100	CUNI-Transfer		
70.7	0.096	Groningen		
70.3	0.072	SRPOL		
71.1	0.066	Helsinki		
70.2	0.055	NRC		
70.2	0.054	UEDIN		
70.1	0.047	UQAM-TanLe		
68.8	0.006	NICT-Kyoto		
68.4	-0.035	OPPO		





Dziękuję za uwagę!



