

Ondřej Bojar; April 8, 2022

Demo throughout the Symposium



To see the live transcription, go to this page: https://elitr.eu/subtitling-at-ecspm-symposium/

Two useful links there:

- Open ELITR demo now: https://quest.ms.mff.../demo.
- Later, help us by filling out our feedback form.

H2020 RIA ELITR (2019–2021 +3 months)



- EU research and innovation project ELITR aims:
 - Highly multi-lingual machine and speech translation.
 - Document-level machine translation.
 - Automatic meeting summarization, "Minuting".



... and the Supreme Audit Office of the Czech Republic as affiliated user partner.

Main ELITR event: Interpreting at EUROSAI Congress (Prague, May 2021).

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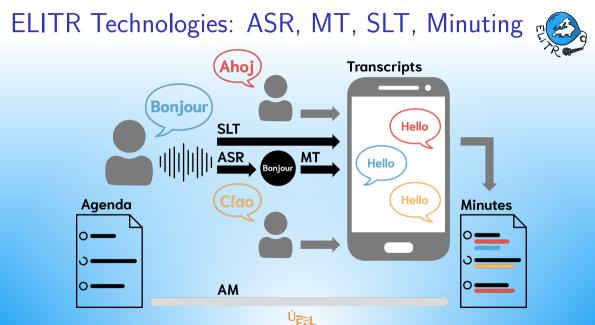
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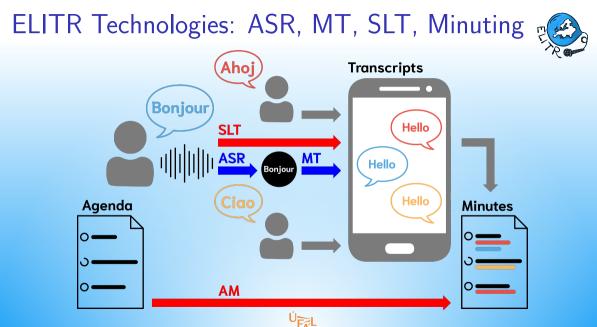
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ELITR Languages



Languages to be supported by the ELITR project:

Technology	Primary Focus	Covered	Experimental
ASR	En, De	Fr, Sp, It, Ru	Cs
SLT & MT	{ En, De }	all EU languages	all EUROSAI langs
	\rightarrow { En, De, Cs }	ightarrow all EU languages	ightarrow all EUROSAI langs
Summarization	English, Czech	-	-

24 EU languages: Bulgarian, Croatian, Czech, Danish, Dutch, English, Estonian, Finnish, French, German, Greek, Hungarian, Irish, Italian, Latvian, Lithuanian, Maltese, Polish, Portuguese, Romanian, Slovak, Slovene, Spanish, and Swedish. Further 19 EUROSAI languages: Albanian, Arabic, Armenian, Azerbaijani, Belorussian, Bosnian, Georgian, Hebrew, Icelandic, Kazakh, Luxembourgish, Macedonian, Moldovan, Montenegrin, Norwegian, Russian, Serbian, Turkish, and Ukrainian.

Combining Two Super-Human Technologies



nature	
ARTICLE https://doi.org/10.1038/s41467-020-18073-9 OPEN	(R) Check for updates
Transforming machine translation: system reaches news translation que comparable to human professionals	uality
Martin Popel© ^{1,583} , Marketa Tomkova© ^{2,5} , Jakub Tomek© ^{3,5} , Łukasz Kais Ondřej Bojar© ¹ & Zdeněk Žabokrtský⊚ ¹	er 💿 ⁴ , Jakob Uszkoreit 🗿 ⁴ ,



Combining Two Super-Human Technologies

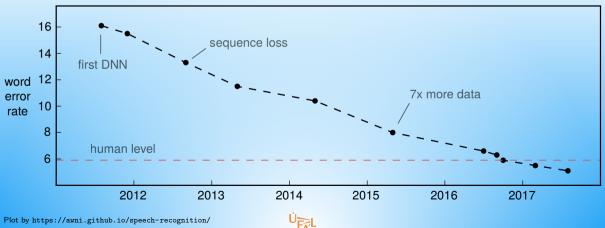


nature		
A Cornell University arXiv.org > cs > arXiv:2010.03449		We gratefully acknowledge support from ons Foundation and member institutions.
	Help Advanced	Search
Computer Science > Computer Vision and Pattern Recognition		Download:
S [Submitted on 7 Oct 2020 (v1), last revised 10 Feb 2021 (this version, v3)]		PDF
C Super-Human Performance in Online Low-latent of Conversational Speech	cy Recognition	Other formats (license)
M Thai-Son Nguyen, Sebastian Stueker, Alex Waibel		Current browse context: cs.CV < prev next >
Achieving super-human performance in recognizing human speech has been a goal	for several decades as	new recent 2010 Change to browse by:

ASR Surpassing Humans



- Switchboard conversational speech benchmark (2000).
- 40 phone calls between two random native English speakers.





MT evaluation is considerably harder than ASR evaluation.
 Bilingual manual assessment of translation quality in WMT18:

Costs are mounting in th	he case, with hundred	s of pages of affidavits, emails and reports	by companies including Deloitt	te. Pitcher
		op barristers including Allan Myers, QC, an		
 Reference text 				
/ tomto případě rostou (Chile má deset členů	a koncem srpna by měl společností, včetné	é společností Deloitte. Pitcher Pa	artners a
		a koncem srpna by měl společností, včetné setně Allana Myerse, QC a vyšších právníc		
Charty Keck Cramer, a š				
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► WMT 2018 English-to-Czech news translation results:

	Ave. %	Ave. z	System
1	84.4	0.667	CUNI-Transformer
2	79.8	0.521	UEDIN
	78.6	0.483	Professional Translation
4	68.1	0.128	ONLINE-B
5	59.4	-0.178	ONLINE-A
6	54.1	-0.354	ONLINE-G



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Caveats:

Humans translated whole documents, MT individual segments.

Evaluation was done for individual segments.



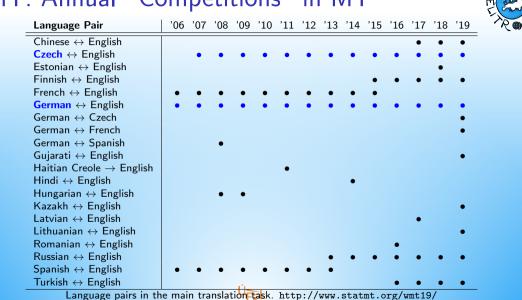
$English \rightarrow Czech$

	Ave.	Ave. z	System
1	91.2	0.642	Professional Translators
2	86.0	0.402	CUNI-DocTransformer-T2T
	86.9	0.401	CUNI-Transformer-T2T-2018
	85.4	0.388	CUNI-Transformer-T2T-2019
5	81.3	0.223	CUNI-DocTransformer-Marian
	80.5	0.206	UEDIN
7	70.8	-0.156	ONLINE-Y
	71.4	-0.195	TARTUNLP-C
9	67.8	-0.300	ONLINE-G
10	68.0	-0.336	ONLINE-B
11	60.9	-0.594	ONLINE-A
12	59.3	-0.651	ONLINE-X



			⊂ngiisn→German			
	$English{ o}Czech$			Ave.	Ave. z	System
	Ave.	Ave. z	System	90.3	0.347	Facebook-FAIR
1	91.2	0.642	Professional Translators	93.0	0.311	Microsoft-WMT19-sent-doc
2	86.0	0.402	CUNI-DocTransformer-T2T	92.6	0.296	Microsoft-WMT19-doc-level
	86.9	0.401	CUNI-Transformer-T2T-2018	90.3	0.240	Professional Translation
	85.4	0.388	CUNI-TRANSFORMER-T2T-2019	87.6	0.214	MSRA-MADL
5	81.3	0.223	CUNI-DocTransformer-Marian	88.7	0.213	UCAM
	80.5	0.206	UEDIN	89.6	0.208	NEU
7	70.8	-0.156	ONLINE-Y	87.5	0.189	MLLP-UPV
	71.4	-0.195	TARTUNLP-C	87.5	0.130	eTranslation
9	67.8	-0.300	ONLINE-G	86.8	0.119	dfki-nmt
10	68.0	-0.336	ONLINE-B	84.2	0.094	online-B
11	60.9	-0.594	ONLINE-A		10 mc	re systems here
$\frac{11}{12}$	59.3	-0.651	ONLINE-X	76.3	-0.400	online-X
12	59.5	-0.051	ONLINE-A	43.3	-1.769	en-de-task

English→German



WMT: Annual "Competitions" in MT

Reality Check: A Fair of Student Firms



https://elitr.eu/clearest-voice-at-trade-fair/ March 2019

And what we are supposed to do is to be invisible and correctly subtitling, and translating what you have said," So, this is the set-up. And if you can reach some English, and if you can read some Czech, then you will see...



ASR of Non-Natives in Noisy Environment

- ► Human error level: 4–6% WER (word error rate).
- Best neural nets are reportedly there, too.
- Our test of 90-second speeches of high-school students:
 - Average WER: 40–50% KIT, 80–90% Google, UEDIN.

The best recognized segment:

Manual	Google	UEDIN	KIT
why do you wear	why do Ø where does	're ready where tells	why do <mark>are</mark> those
those high heels ,	high heels if you	us if you would Ø	highs heels if you
if you would wear	would wear some	sneaker <mark>us</mark> I know	would where some
some sneakers ?	sneakers I no one re-	won the really good	sneakers i no one re-
I know one really	ally good star that	store that deals with	ally good story that
good store, that	deals with the sale	the sale of free <mark>down</mark>	deals with the sale of
deals with the sale	of freedown food to	food	freetime food to our
of freetime footwear	our Ú _F	≅∠	



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some sneakers ?	sneakers I no one re-	won the really good	sneakers i no one re-
I know one really	ally good star that	store that deals with	ally good story that
good store, that	deals with the sale	the sale of freedown	deals with the sale of
deals with the sale	of freedown food to	food	freetime food to our
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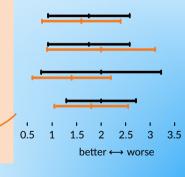


MT of Full Documents: Audit Reports

Manual evaluation by domain experts, scoring in categories:

- 1. Language Resources Spelling and Morphology
- 2. Vocabulary Adequacy of Terms Used
- 3. Vocabulary Clarity of the Text in Terms of Used Words
- 4. Syntax and Word Order
- 5. Coherence and Overall Understanding of the Text

plotted as average rank for better comparibility



Reference

en-cs



Best System

MT of Full Documents: Agreements Input



Supplement No. 1 to the agreement on the sublease the apartment, of 13th May 2016 On the day, month and year written below Marta Burešová, pers. no. 695604/3017 Address: Radimova 8, Prague 6, 169 00 as the tenant on the one hand (Hereinafter referred to as "the tenant") and Karolína Černá, pers. no. 136205/891 Address: Alfrédova 13, Praha 4, 142 00 As a lessee on the other (Hereinafter referred to as "the lessee") collectively also referred to as "the Contracting parties" have agreed on this Supplement No. 1 to the Agreement on the sublease the apartment, of 13th May 2016 (hereinafter referred to as the "Supplement No. 1")

I. Introductory Provisions

On 13th May 2016, the tenant and the lessee closed the Agreement on the sublease of the apartment, under which the tenant let the lessee use the apartment No. 4 (area 49 m²) of size 1+1/L in the ground floor of the house in Prague 4, Alfrédova 13, ...



MT of Full Documents: Agreements Output



Dodatek č. 1 ke smlouvě o podnájmu bytu ze dne 13. května 2016 V den, měsíc a rok níže napsané Marta Burešová, pers. no. 695604/3017 Adresa: Radimova 8, Praha 6, 169 00 jako nájemce na jedné straně (dále jen "nájemce") a Karolína Černá, pers. no. 136205/891 Adresa: Alfrédova 13, Praha 4, 142 00 jako nájemce na straně druhé (dále jen "nájemce") společně označované také jako "smluvní strany" se dohodly na tomto dodatku č. 1 ke smlouvě o podnájmu, dále jen "nájemní smlouva", dále jen "13. května 2016").

I. Úvodní ustanovení

Dne 13. května 2016 nájemce a nájemce uzavřeli smlouvu o dalším pronájmu bytu, podle níž nájemce pronajímá nájemci byt č. 4 (plocha 49 m²) o velikosti 1+1/l v přízemí domų v Praze 4, Alfrédova 13, ...

MT of Full Documents: Agreements Output



- Dodatek č. 1 ke smlouvě o podnájmu bytu ze dne 13. května 2016 V den, měsíc a rok níže napsané Marta Burešová, pers. no. 695604/3017 Adresa: Radimova 8, Praha 6, 169 00 jako nájemce na jedné straně (dále jen "nájemce") a Karolína Černá, pers. no. 136205/891 Adresa: Alfrédova 13, Praha 4, 142 00 jako nájemce na straně druhé (dále jen "nájemce") společně označované také jako "smluvní strany" se dohodly na tomto dodatku č. 1 ke smlouvě o podnájmu, dále jen "nájemní smlouva", dále jen "13. května 2016").
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Some of ELITR Speech Translation Challenges Input quality:



- Sound (microphone, background, ...), speaker specifics, dialects, ...
 ASR:
 - Training data, training data, training data, training data, training data, ...
 - Jargon, named entities, abbreviations, domain-specific terms, ...
- Spoken Language Translation:
 - Segmentation, adding punctuation.
 - Latency trade-off: translate sooner with less context or better wait?
 - All MT problems: Ambiguity, context, rare words, multilinguality, ...

Delivery:

- Wifi failing in crowded areas. Font too small.
- People cannot follow slides, speaker and subtitles on handheld device.























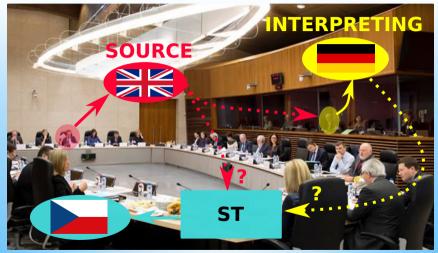










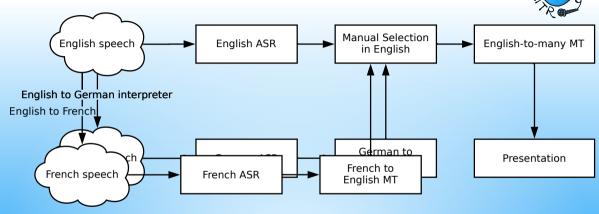




ELITR's Answer: Follow All Manual Selection English speech English ASR English-to-many MT in English English to German interpreter German to German ASR German speech Presentation Enalish MT

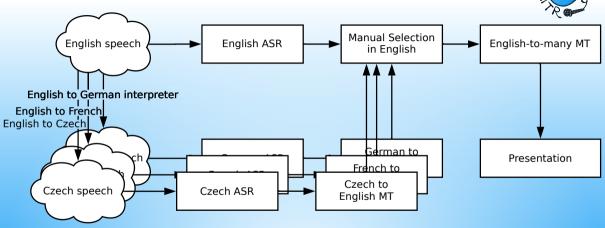
More details in Bojar et al. (2021), **Operating a Complex SLT System with Speakers** and Human Interpreters; https://aclanthology.org/2021.mtsummit-asltrw.3/

ELITR's Answer: Follow All



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ELITR's Answer: Follow All



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Various Demo Videos

P R R

- Initial test at 2019 Student Firms Fair: https://elitr.eu/the-reverse-babelfish/
- CUNI Open Doors Day: https://elitr.eu/a-tireless-interpreter/
- ASR demo in Full Lecture on Complexity of Our Goals: https://lectures.ms.mff.cuni.cz/view.php?rec=455
- Unpublished demo of Czech→many subtitling: http://ufallab.ms.mff.cuni.cz/~bojar/elitr/720p.mp4
- Coming soon: Popularization of SLT in conference setting: https://www.youtube.com/watch?v=WZy5cGY7JFc

Recipe to See Miracles Happen

E R

- 1. Define a task.
- 2. Provide training and test data.
- 3. Run a "competition", a shared task.
- 4. Repeat until satisfied.

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- ► WMT does this for machine translation.
- IWSLT for spoken language translation.



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- WMT does this for machine translation.
- ► IWSLT for spoken language translation.
- ELITR is starting this for meeting summarization.
 - See our AutoMin 2021 shared task: https://elitr.github.io/automatic-minuting/



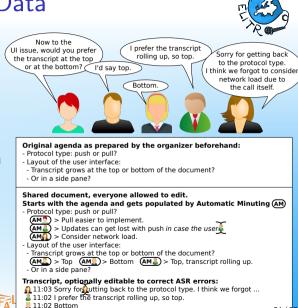


Minuting: We Need Your Data

We need:

- Audio and/or Transcripts.
- Agenda
 - Ideally hierarchical.
- Minutes
 - Ideally the Agenda populated with items.
- Any supplementary files:
 - Slides, related reports, ...

Please contact us at info@elitr.eu.







- ASR and MT do surpass humans, but in very specific settings only.
- Some robustness is achievable through very large training data.
- For ASR, the **input acquisition** is critical, tiny details kill.
- For MT, handling **context** is now essential, more so in speech.
- Automatic Minuting is still very much starting.
 We need your work meetings data!





Thank you!



