

92586 Computational Linguistics

Lesson 20. Beyond

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Ad: TinfFoil Seminar; Friday 13th, 10 to 12, dit.lab, I16

Lavinia Aparaschivei · 2nd-year PhD student

Are Crescia and Piadina the same? Towards Identifying Synonymy or non-Synonymy between Italian words to Enable Crowdsourcing from Language Learners
CLIC-it 2022, Milan, Italy

Katerina Korre · 1st-year PhD student

Enriching Grammatical Error Correction Resources for Modern Greek
LREC 2022, Marseille, France

Arianna Muti · 1st-year PhD student

A checkpoint on multilingual misogyny identification
ACL Student Workshop 2022, Dublin, Ireland
LeaningTower@LT-EDI 2022: When hate and hope collide
LT-EDI@ACL 2022, Dublin, Ireland

Francisco Jañez · Erasmus+ visiting PhD student, Universidad de León (Spain)
On spotting propaganda in spam email

Alberto Barrón

Informal talk: attending conferences (time allowing)

Better text generation

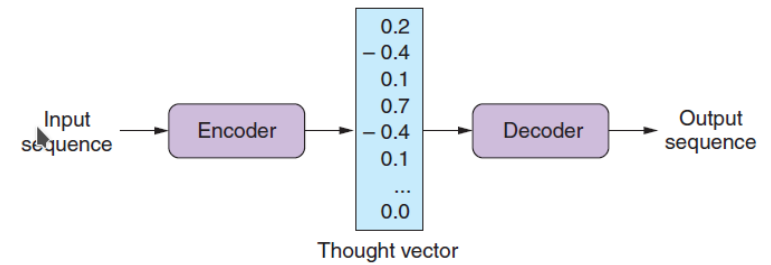
Adding Extra Stuff

- ▶ Expand the quantity and quality of the corpus
- ▶ Expand the complexity of the model (units/layers/LSTMs)
- ▶ Better pre-processing:
 - ▶ Better case folding
 - ▶ Break into sentences
- ▶ Post-processing
 - ▶ Add filters on grammar, spelling, and tone
 - ▶ Generate many more examples than actually shown to users
- ▶ Select better seeds (e.g., context, topic)

Most of these strategies apply to any problem you can think about!

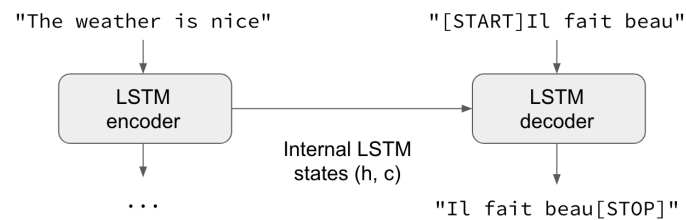
Sequence-to-Sequence Models

Encoder-Decoder architecture



(Lane et al., 2019, 315)

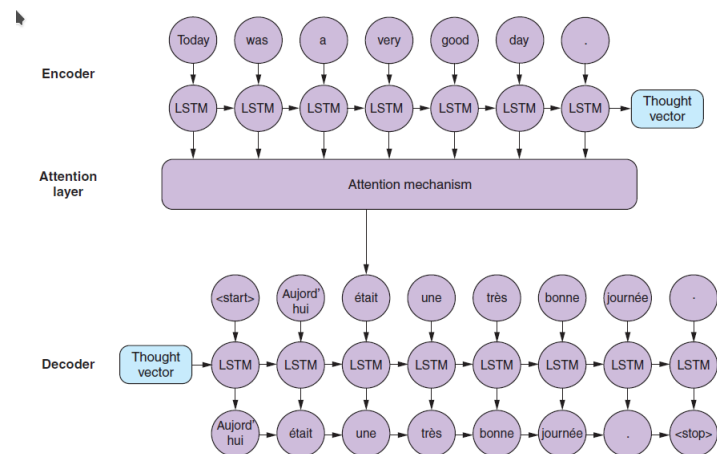
seq2seq models



<https://blog.keras.io/a-ten-minute-introduction-to-sequence-to-sequence-learning-in-keras.html>

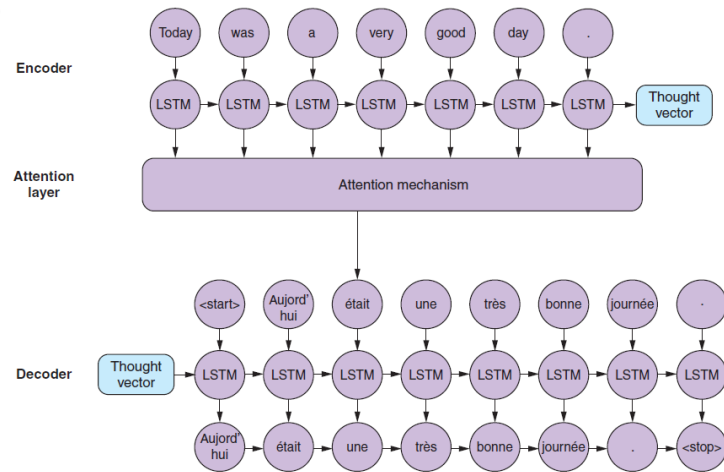
Sequence Labelling

- Part-of-speech tagging
- Dependency parsing
- Named entity recognition



(Lane et al., 2019, 334)

Attention is all you need



(Vaswani et al., 2017); Figure from (Lane et al., 2019, 334)

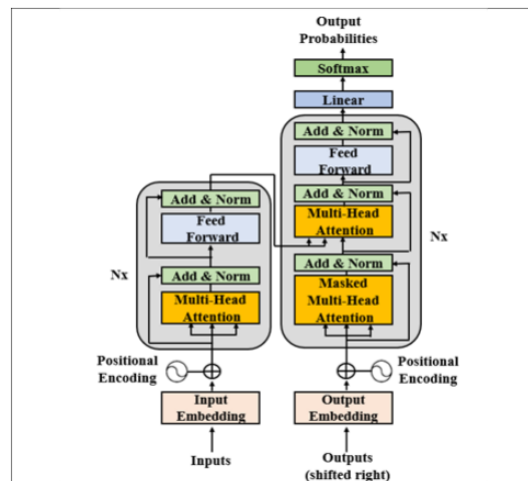
Transformers

A Transformer [...] helps in transforming one sequence of input into another depending on the problem statement. Examples:

- Translation from one language to another
- Paraphrasing
- Question answering

<https://medium.com/data-science-in-your-pocket/attention-is-all-you-need-understanding-with-example-c8d074c37767>

Transformers

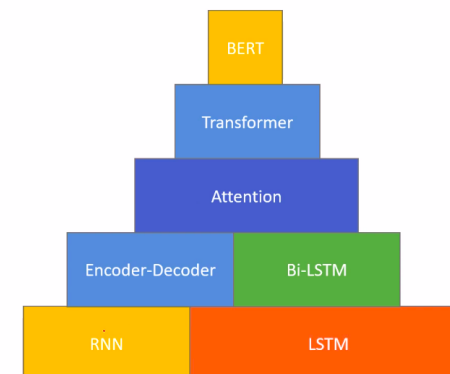


Vaswani et al. (2017)

Transformers: BERT

Bi-directional encoder representations from transformers

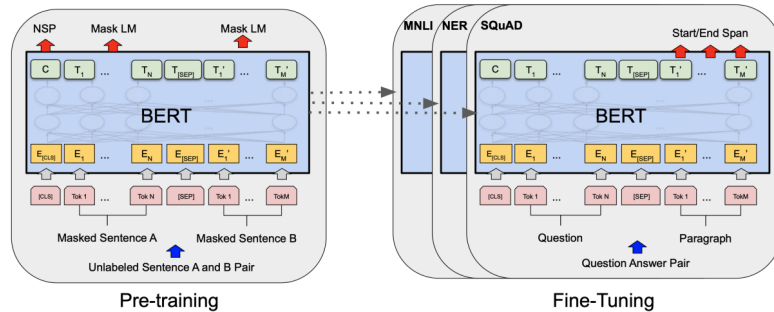
Learning pyramid:



Picture from <https://iq.opengenus.org/introduction-to-bert/>

Transformers: BERT

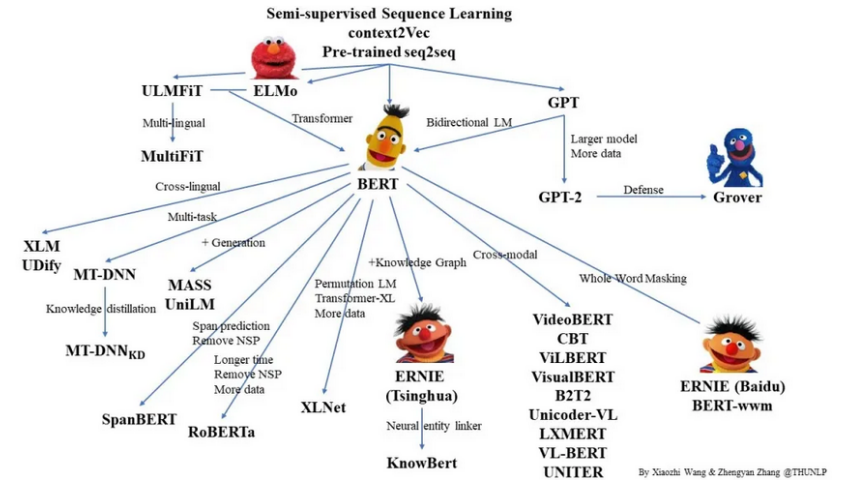
Bi-directional encoder representations from transformers



(Devlin et al., 2019)

Picture from <https://towardsdatascience.com/bert-why-its-been-revolutionizing-nlp-5d1bcae76a13>

BERT Family



Picture from <https://neptune.ai/blog/bert-and-the-transformer-architecture-reshaping-the-ai-landscape>
(actually from <https://github.com/thunlp/>)

BERT in other Languages

For instance:

- Spanish (Cañete et al., 2020)
- Italian (AlBERTo) (Polignano et al., 2019)

Use example: misogyny identification in Italian

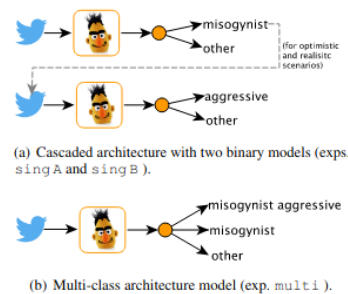


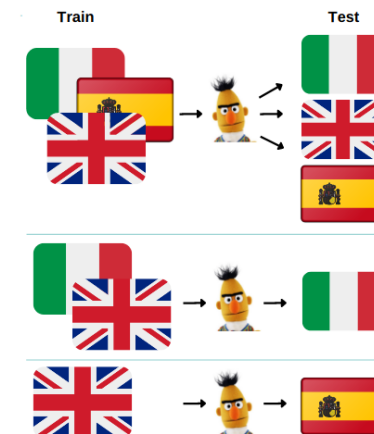
Figure 1: The two alternative system architectures for misogyny and aggressiveness identification.

(?)

Multilingual models

What makes multilingual BERT multilingual? (Liu et al., 2020)

Use example: multilingual misogyny identification



(Muti and Barrón-Cedeño, 2022 to appear)

(Other) Reference Libraries

- ▶ **Spacy**
Industrial-Strength Natural Language Processing
<https://spacy.io/>
- ▶ **Stanza**
A Python NLP Package for Many Human Languages
<https://stanfordnlp.github.io/stanza/>
- ▶ **Hugging Face**
The AI community building the future
<https://huggingface.co/>

Recap

Conferences (non-exhaustive)

NLP-ish	IR-ish	MT-ish
Top		
ACL	SIGIR	WMT
EMNLP	CIKM	EAMT
NAACL	WSDOM	
EACL	ECIR	
Nice		
SemEval	CLEF	
CICLing	TREC	
LREC		
National		
CLIC-it	IIR	
Evalita		

Recap: The path

1. Baby steps into computing
2. What is NLP? From rule-based to statistical
3. Pre-processing text: tokens, stemming, stopwording. . .
4. From words to vectors: the vector space model
5. A few supervised models
6. Training and evaluating in machine learning
7. From words to meaning: topic modeling
8. Using one neuron: perceptrons
9. Fully-connected neural networks
10. From words to semantics: word embeddings
11. Taking snapshots of text: CNNs
12. Texts as sequences: (Bi)RNNs
13. Using a better memory: LSTM
14. LSTM to produce text

Recap: The future path

- ▶ We covered Parts 1 and 2 of Lane et al. (2019) (up to Section 9)
- ▶ That's 9 out of 13 chapters of *Natural Language Processing in Action*

You are ready to go on your own now and become a star

Now go and celebrate the end of the course



...and worry about your project from Monday!

- ▶ I'm available until mid-July for 1-to-1 discussion on your project **upon request!**

References

- Cañete, J., G. Chaperon, R. Fuentes, J.-H. Ho, H. Kang, and J. Pérez
2020. Spanish pre-trained bert model and evaluation data. In *PML4DC at ICLR 2020*.
- Devlin, J., M.-W. Chang, K. Lee, and K. Toutanova
2019. Bert: Pre-training of deep bidirectional transformers for language understanding.
- Lane, H., C. Howard, and H. Hapkem
2019. *Natural Language Processing in Action*. Shelter Island, NY: Manning Publication Co.
- Liu, C.-L., T.-Y. Hsu, Y.-S. Chuang, and H. yi Lee
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- Muti, A. and A. Barrón-Cedeño
2020. UniBO@AMI: A Multi-Class Approach to Misogyny and Aggressiveness Identification on Twitter Posts Using AIBERTO. In *Proceedings of the 7th evaluation campaign of Natural Language Processing and Speech tools for Italian (EVALITA 2020)*.

Polignano, M., P. Basile, M. de Gemmis, G. Semeraro, and