

ELMO, BERT, GPT

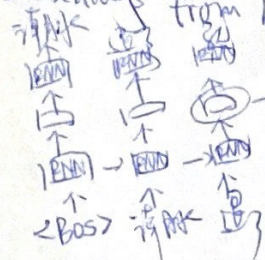
contextualized word embedding.

money bank

river bank

blood bank

Embeddings from Language Model



word embedding of

RNN-based language models. (trained from lots of sentences)
不需要 label data.

+ LSTM RNN

word embedding = (RNN word embedding)

Each layer in deep LSTM can generate a latent representation

final word embedding = $2 \cdot \vec{z} + \vec{h}$ = R-layer word embedding + $2 \cdot \vec{z} + \vec{h}$ = R-layer word embedding.

learned with downstream tasks

Bidirectional Encoder Representations from Transformers (BERT): encoder of Transformer

input sequence, output - word embedding.
one-hot encoding

learned from a large amount of text without annotation

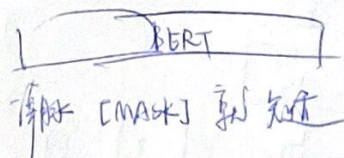
Although word as unit here,

character may be a better choice for Chinese
词 (40000 个)

vocabulary size
linear multi-class classifier

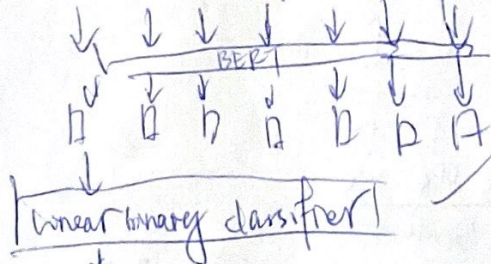
Training of BERT: ① Masked LM = 15% mask

② next sentence prediction: 判断是否连续
boundary of 2 sentences



embedding 图像

the position that
outputs classifier results

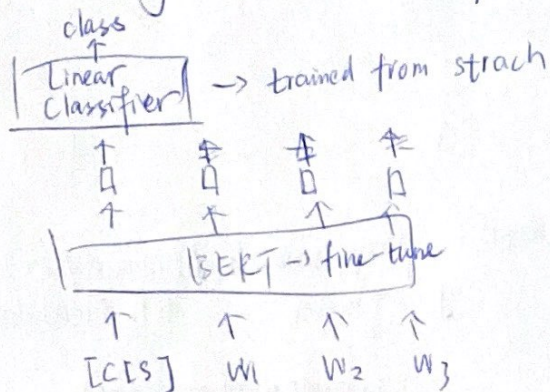


一起训练

如何用了 how to use BERT (与 downstream task 结合一起).

How to use BERT - Case I

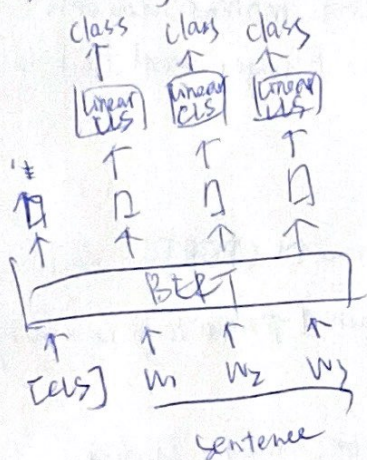
input: single sentence output: class



multilingual BERT (104 语言)

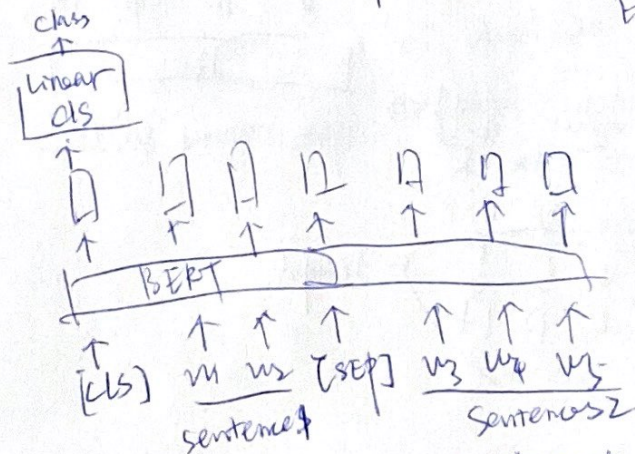
多语言模型在英文上训练 → 识别各种语言

Case I: input: single sentence output: class of each word



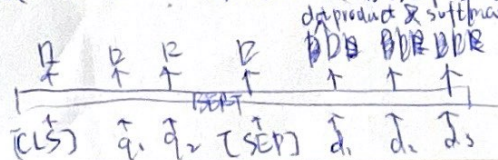
Example: slot filling

Case II: input: two sentences output: class



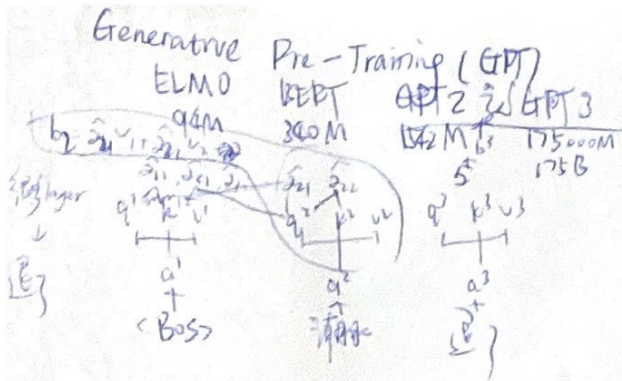
Example: NLI

Case IV: Extraction-based question



document question → [QA model] → start → end

start → end → learn from scratch if e.c.s. 学习答案



→ transformer decoder

GPT-2 is release to the public with BERT 2.0

zero-learning?

reading comprehension.

d_1, d_2, \dots, d_N , "Q:", q_1, \dots, q_n , "A:"

Summarization

GPT-2
random

d_1, d_2, \dots, d_N , "TLDR:"

Translation

English sentence / French sentence /

_____ 2 = _____ 2

_____ 3 =

In-context

~~Few-shot~~ learning: no gradient descent

closed book QA (open-domain QA)

Trivia QA. 175B with QA few-shot example. ~~2.5B~~ fine-tuned SOTA

NLZ, GPT-3 7.5B. ANLI Pounds