

BERT

Bidirectional **E**ncoder
Representations from
Transformers

Architecture

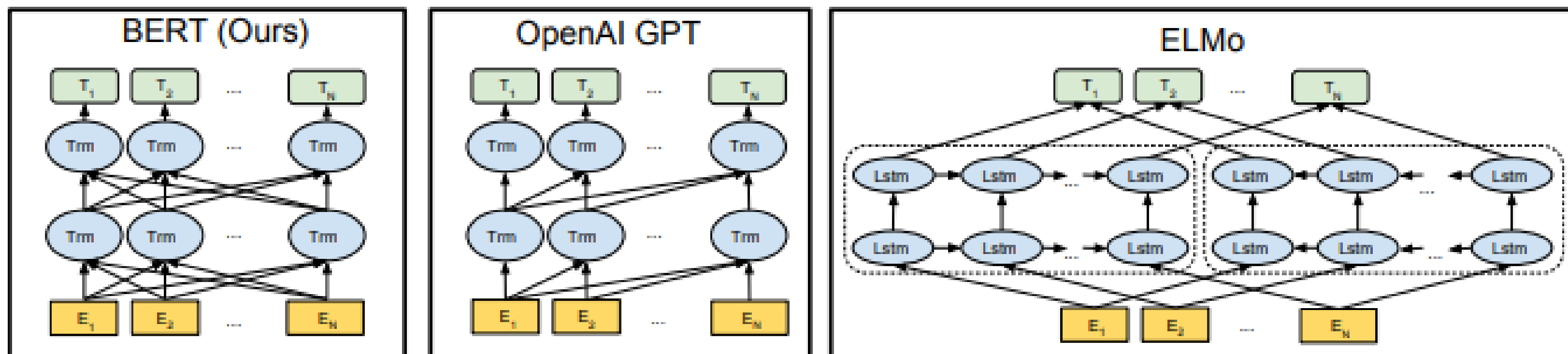
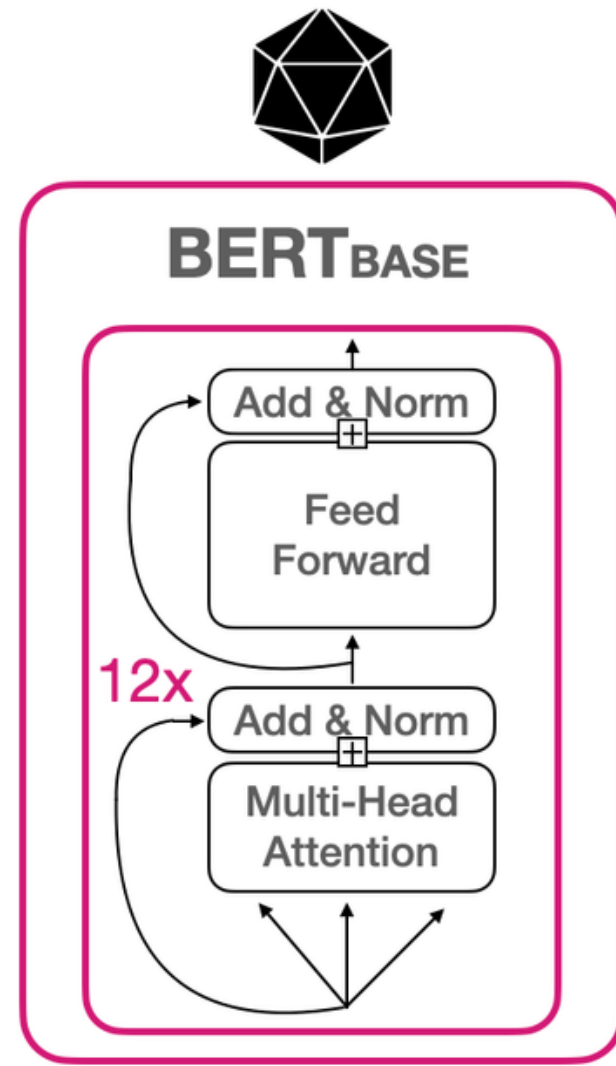


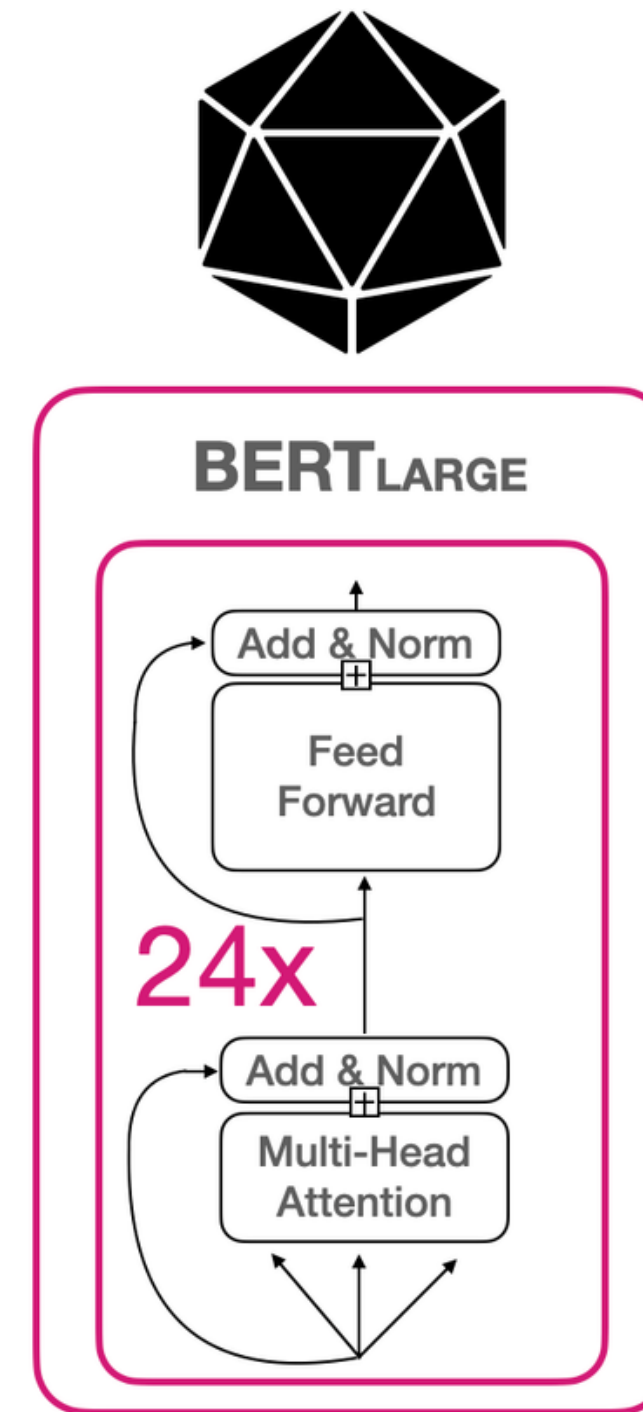
Figure 1: Differences in pre-training model architectures. BERT uses a bidirectional Transformer. OpenAI GPT uses a left-to-right Transformer. ELMo uses the concatenation of independently trained left-to-right and right-to-left LSTM to generate features for downstream tasks. Among three, only BERT representations are jointly conditioned on both left and right context in all layers.

Architecture

BERT Size & Architecture



110M Parameters



340M Parameters



Input Representation

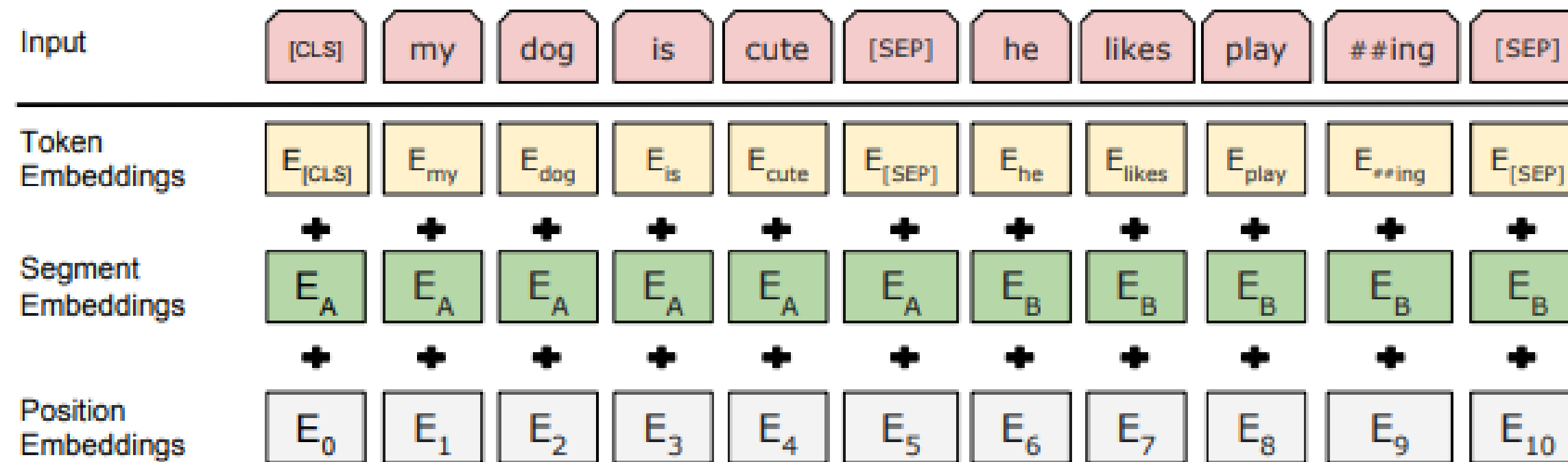
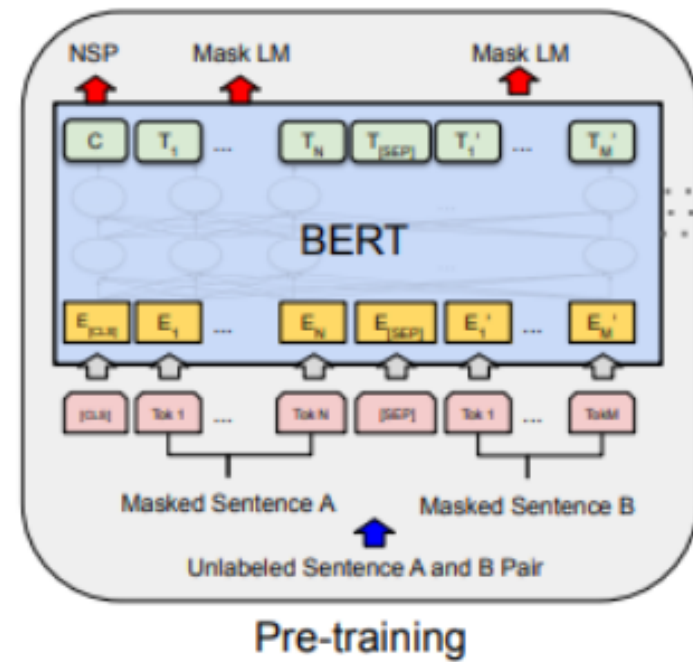


Figure 2: BERT input representation. The input embeddings is the sum of the token embeddings, the segment embeddings and the position embeddings.

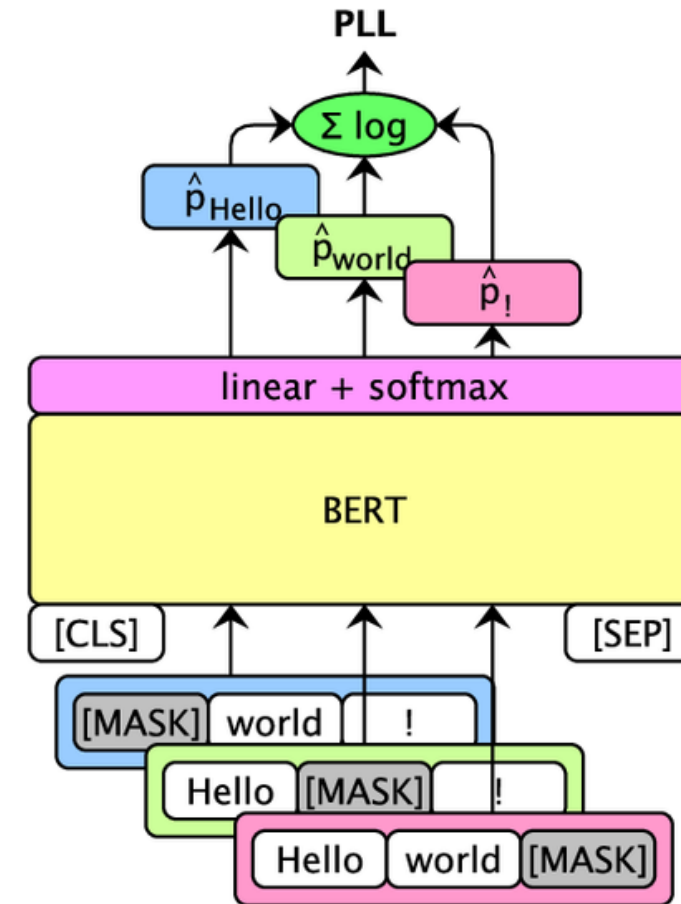
→ Thêm Segment Embedding

→ Học thêm về mối tương quan của các câu

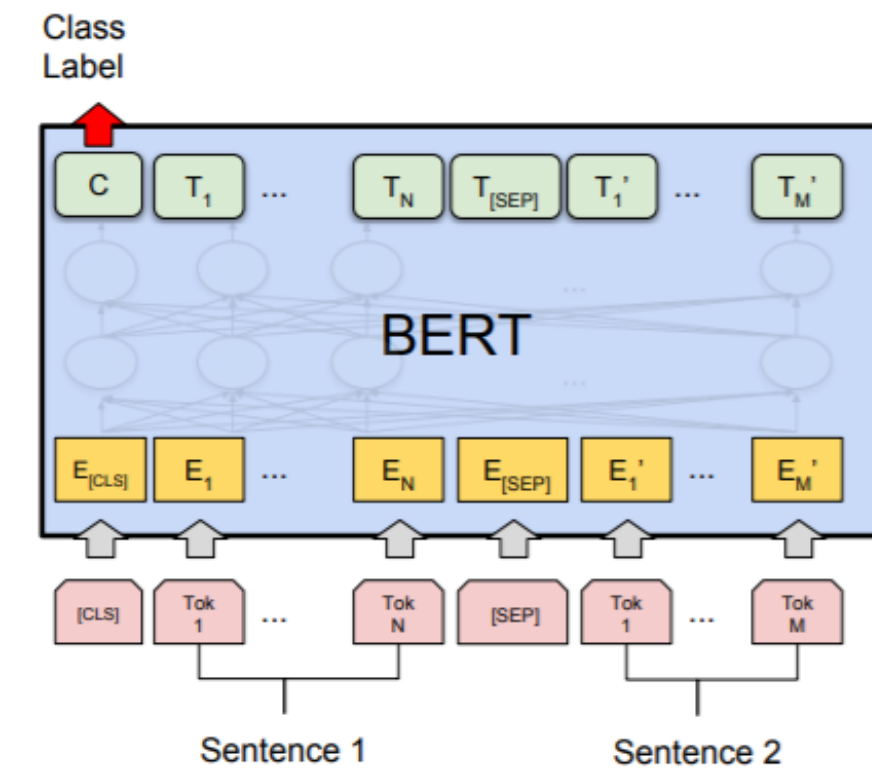
Pre-training Tasks



Mask LM



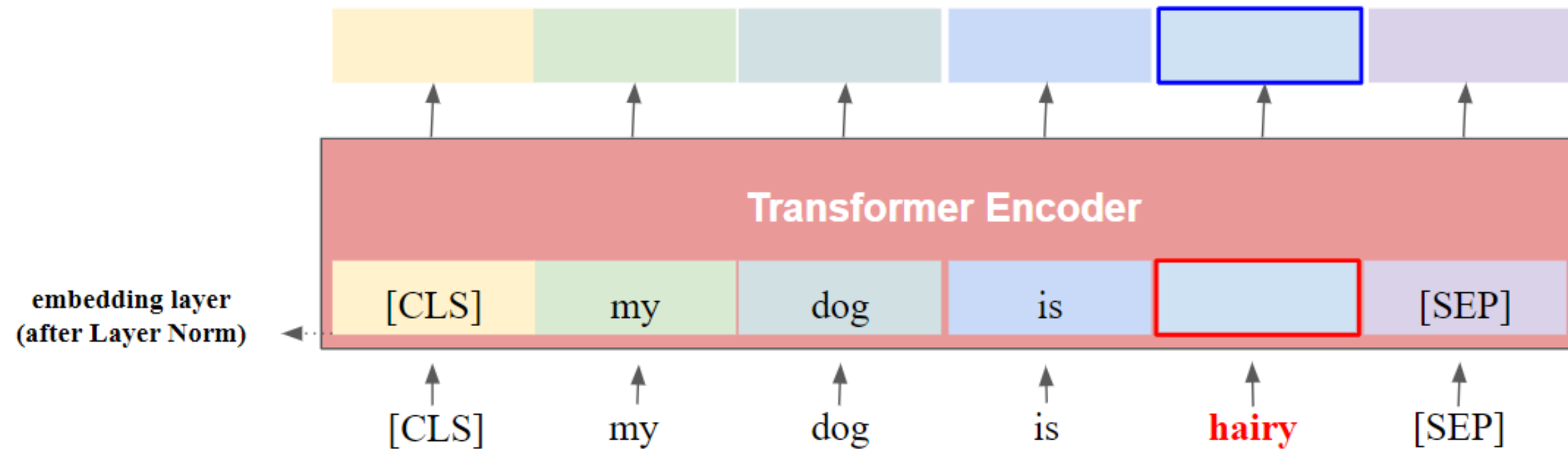
Next Sentence Prediction



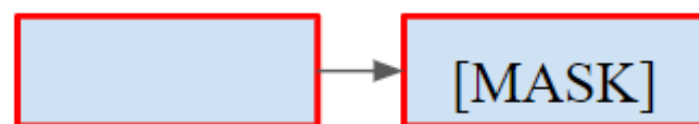
(a) Sentence Pair Classification Tasks: MNLI, QQP, QNLI, STS-B, MRPC, RTE, SWAG

MASK LM

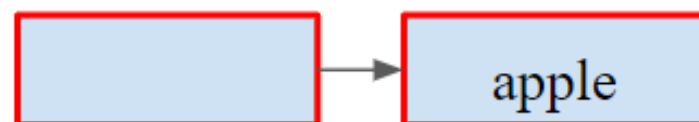
Target: Học cách dự đoán dựa trên bối cảnh \longrightarrow Che đi một phần dữ liệu



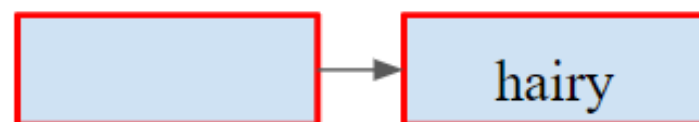
Mask **15%** of all WordPiece tokens in each sequence at **random**. (e.g., **hairy**)



80% of the time : Replace **[MASK]** token.

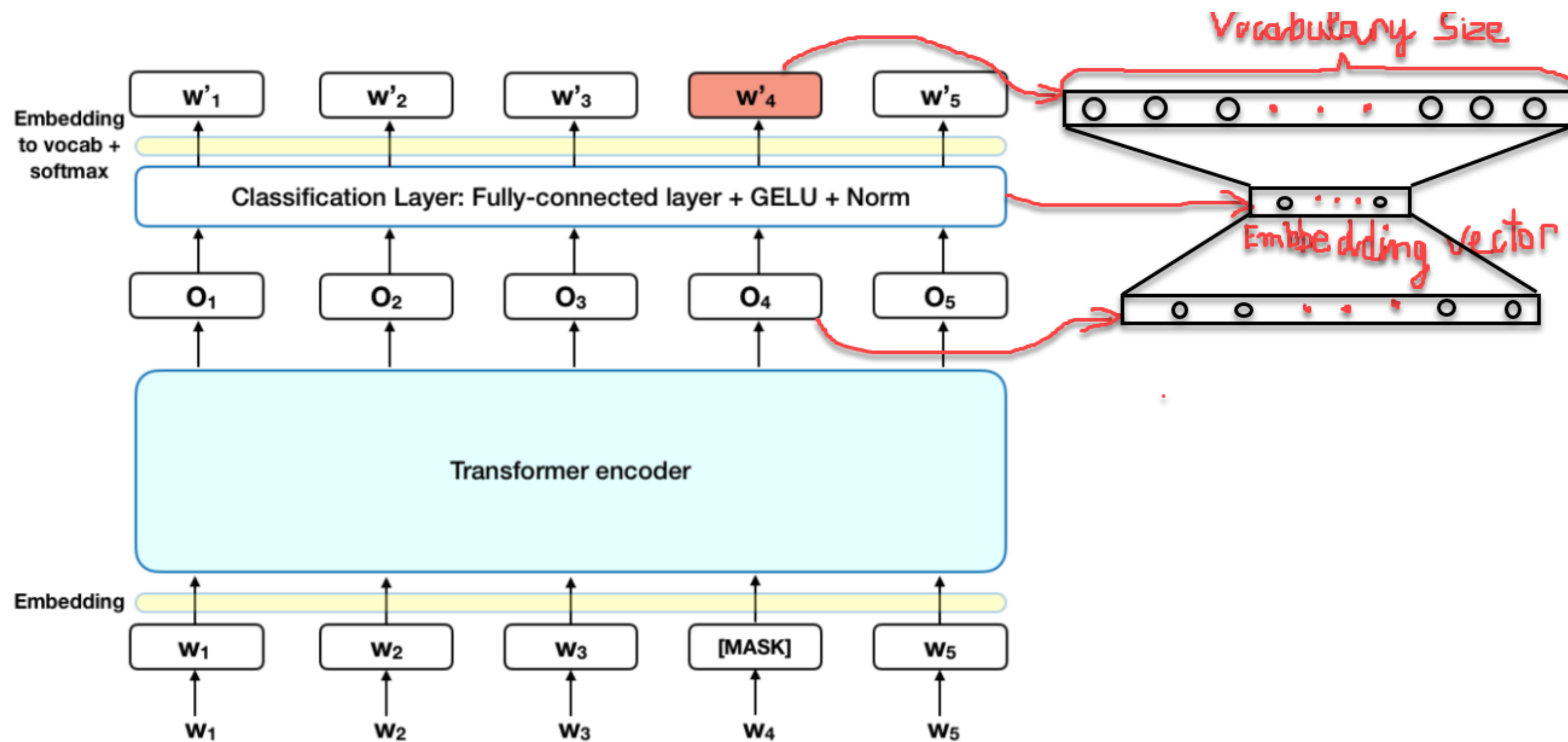


10% of the time : Replace the word with a **random** word

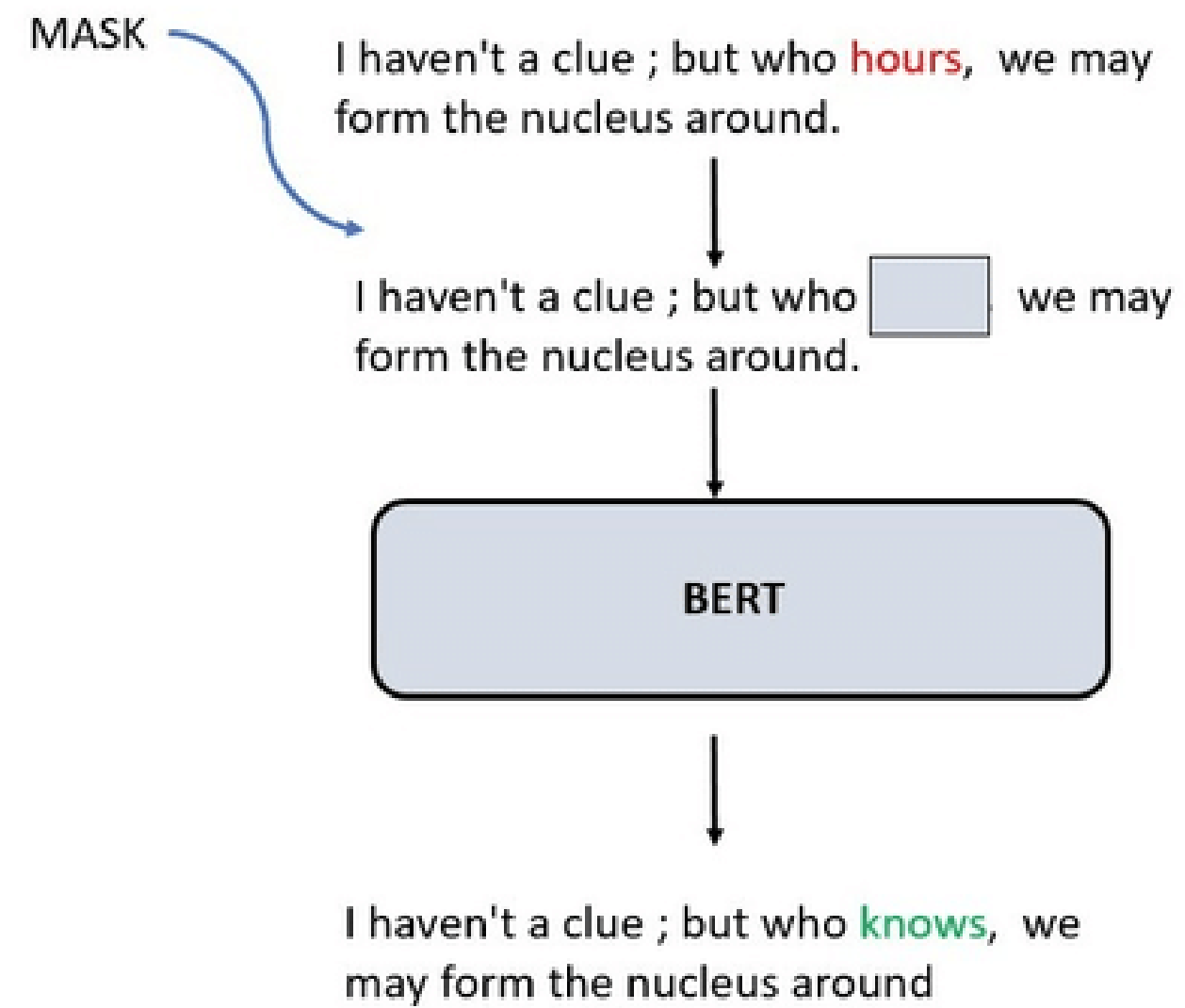
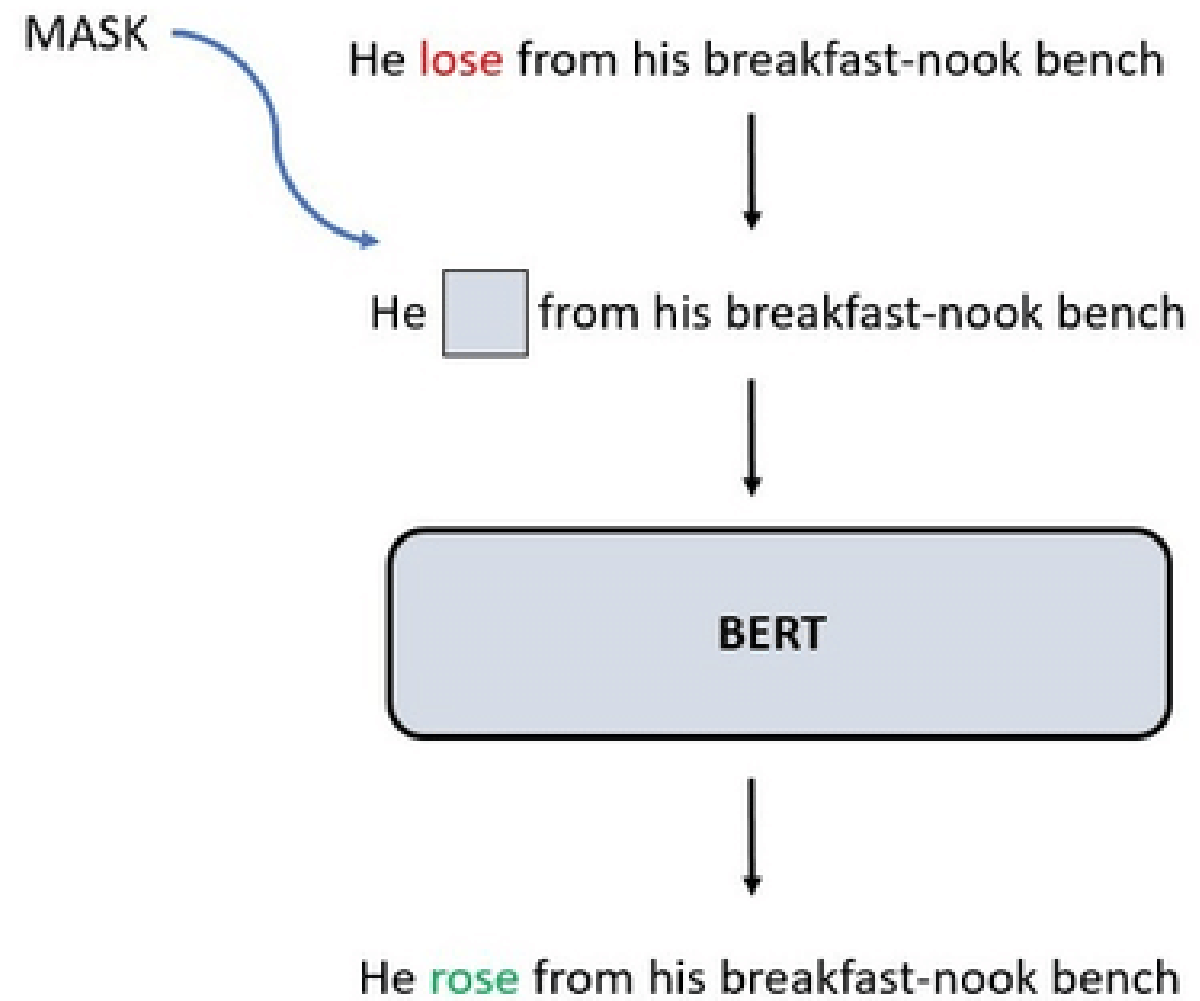


10% of the time : Keep the word **unchanged**.

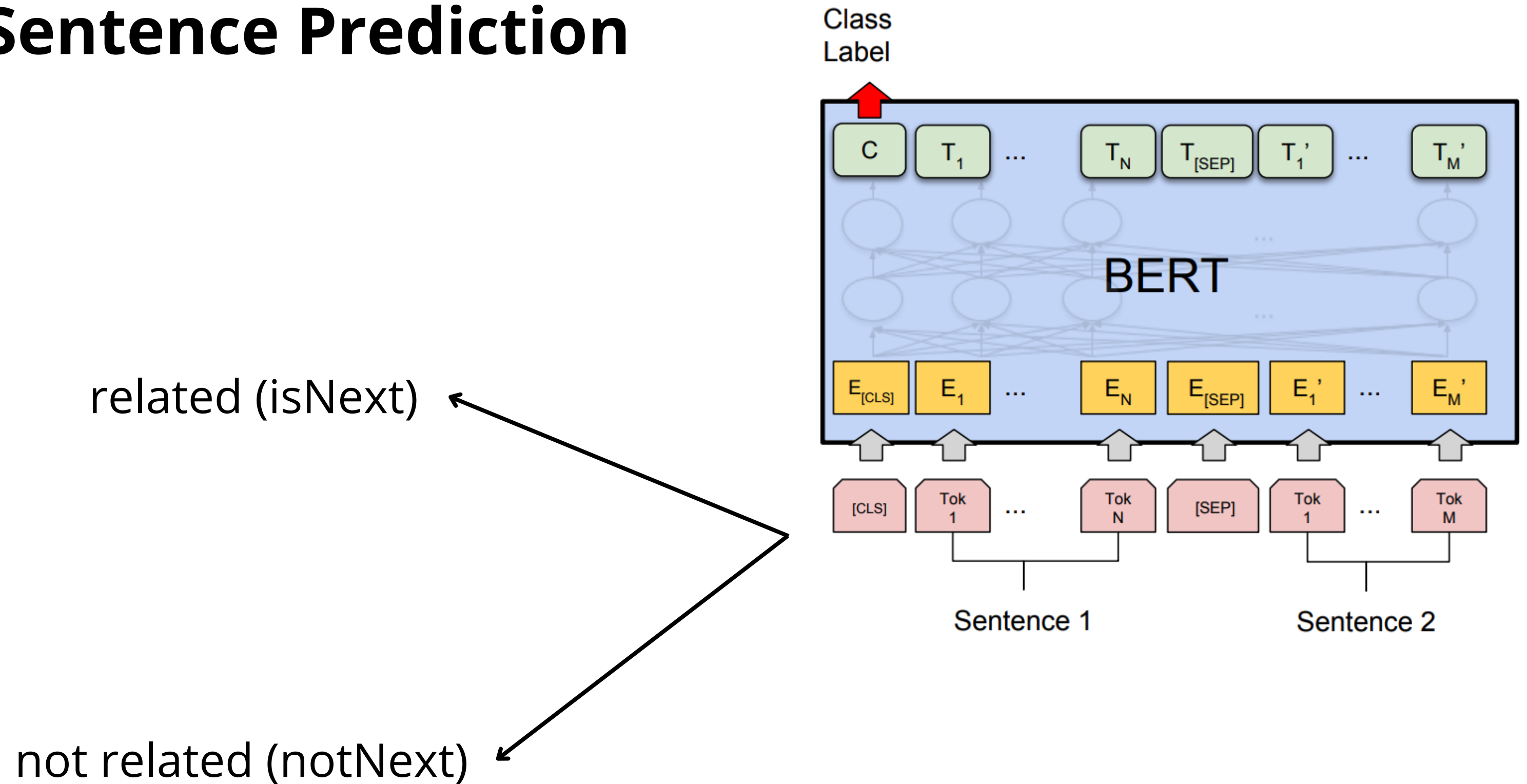
MASK LM



MASK LM



Next Sentence Prediction



Reference

- <https://www.miai.vn/2020/12/14/bert-series-chuong-1-bert-la-cai-chi-chi/>
- <https://viblo.asia/p/hieu-hon-ve-bert-buoc-nhay-lon-cua-google-eW65GAN0ZDO>



Thanks for watching!