How multitasking benefits QA Retrieval

Dataset: SQuAD2.0, MNLI, CoLA, QNLI, RTE

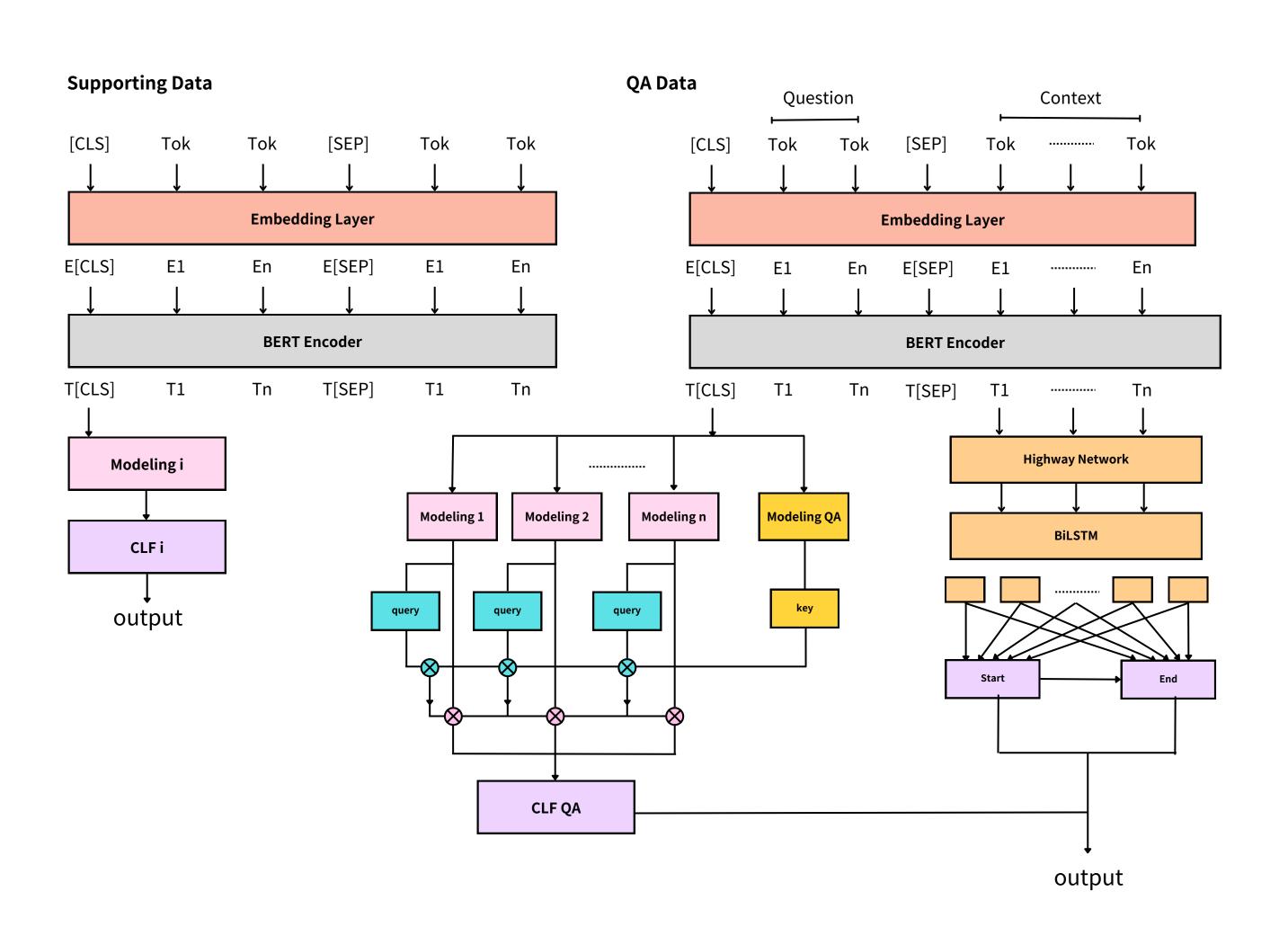


OUR GOALS

Increase the performance of classification in Squad 2.0

We tried some multitasking mechanism to help the model get more weight on the [CLS] token, also make sure that answerable questions work properly.

MODEL STRUCTURE



For supporting Data

Shared layer: Embedding, BERT Encoder

Specific layer: Modeling, Classifier

Input format: [CLS] sentence1 [SEP] sentence2

Using modeling QA to get the key, then do the single-head self-attention to the N modeling results. Ultimately, use the CLF QA to determine if the context has the answer.

Linear(Concatenate the last 4 hidden states in BERT Encoder)

BERT Pooler(T[CLS])

For QA retrieval Data

Shared layer: Embedding, BERT Encoder, Supporting Data Modeling

Specific layer: other

Input format: [CLS] question [SEP] context

Extract the representation of context *Ti*, fed into the Highway to refine the BERT-embedded representation and pass through the LSTM layer to get the new *Ti*.

Highway network:

 $x_{p} = ReLU(W_{P}T_{i} + b_{P})$ $x_{gate} = \sigma(W_{gate}T_{i} + b_{gate})$ $x_{highway} = x_{gate} \bigcirc x_{P} + (1 - x_{gate}) \bigcirc T_{i}$

BiLSTM:

 $\{b_1, b_2, \dots, b_L\} = BiLSTM(\{x_1, x_2, \dots, x_L\})$

ACC & LOSS & F1 SCORE

Result of 70k SQuAD2.0

	Has answer F1 score	No answer F1 score	Has answer accuracy	No answer accuracy
Vanilla	0.6990	0.7695	0.8712	0.7610
MTL	0.7031	0.7958	0.8818	0.7897

Result of 7k SQuAD2.0

	Has answer F1 score	No answer F1 score	Has answer accuracy	No answer accuracy	No answer recall
Vanilla	0.5502	0.9772	0.8361	0.9715	0.5581
MTL	0.6980	0.7672	0.9229	0.7550	0.6760

EXAMPLE FOR QA

Multi-hop question:

Sam walks into the kitchen.
Sam picks up an apple.
Sam walks into the bedroom.
Sam drops the apple.

Q: Where's the apple?

MTL: bedroom (has answer probabiliy: 0.9120)

Vanilla: sam picks up an apple. sam walks into the bedroom (has answer probabiliy: 0.7799)

The punctuation effect:

After the 1980s, the use of the "Canadian Armed Forces" name gave way to "Canadian Forces";[citation needed] The "Canadian Armed Forces" name returned in 2013

Q: What is the old name of the Canadian Forces?

MTL: NO ANSWER (has answer probabiliy: 0.4855)
Vanilla: NO ANSWER (has answer probabiliy: 0.2459)

After the 1980s, the use of the "Canadian Armed Forces" name gave way to "Canadian Forces",[citation needed] The "Canadian Armed Forces" name returned in 2013

Q: What is the old name of the Canadian Forces?

MTL: "canadian armed forces" (has answer probabiliy: 0.5331)

Vanilla: NO ANSWER (has answer probabiliy: 0.2716)