Sentence-level Sentiment Classification with PyTorch

Homework 4 for Introduction to Deep Learning, Fall 2019

Deadline: 2019.12.10 23:59:59

1 Introduction

Stanford Sentiment Treebank (SST) is dataset for sentiment classification in machine learning field. It contains 11855 sentences, and has been split into the training / validation / test parts, respectively containing 8,544 / 1,101 / 2,210 sentences.

Note: During training, information about testing examples should never be used in any form.

1.1 Data Format

Every line in SST: Label(Sentiment) + Data(Sentence) There are five kinds of annotations in label: 0-"very negative"; 1-"negative"; 2-"neutral" 3-"positive"; 4-"very positive". Digits in MNIST range from 0 to 9. Some examples are shown below.

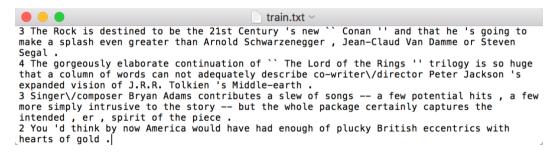


Figure 1: Examples of data in SST

1.2 Data Preprocessing

Torchtext is recommended for loading and preprocessing SST data. To install torchtext, you can use

- pip install torchtext

We provide some start codes for SST DataLoader, which are included in tips code.py.

To learn more about Torchtext, you can read some documents about TorchText: <u>Torchtext Doc, SST Dataset Source Code</u>, and Another Code for Preprocessing SST

1.3 Introduction for Word Embedding

Word Embedding is used in our Dataloader code. The embedding layer is used to transform the word into a dense embedding vector. This embedding layer is simply a single fully connected layer. You can see torch.nn.Embedding to learn more details. The input is firstly passed through the embedding layer to get embedded, which gives us a dense vector representation of our sentences. embedded is

then fed into the RNN. For simplicity, we use pre-trained word embeddings. Codes for pre-trained embeddings are provided. You can also use other pre-trained embeddings in this task. Figure 1.3 shows the basic process for sentiment classification.

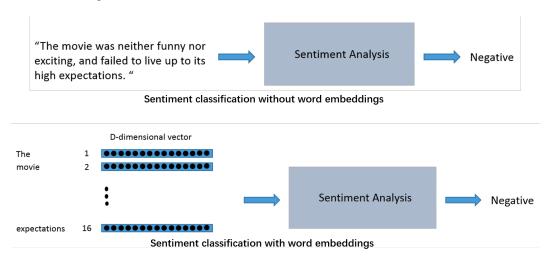


Figure 2: Basic process for sentiment classification

1.4 Introduction for RNN in Pytorch

RNN is a basic network for sequence processing. Pytorch provides many kinds of RNN such as "RNN", "LSTM" and "GRU". You can check them in https://pytorch.org/docs/stable/nn.html#recurrent-layers

Here are some examples:https://pytorch.org/tutorials/beginner/nlp/sequence_models_tutorial.html#sphx-glr-beginner-nlp-sequence-models-tutorial-py

1.5 Example Architecture for Sentiment Classification

Here are two examples of network architecture: Figure 3 and Figure 4.

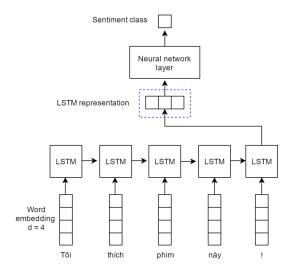


Figure 3: Model architecture example 1

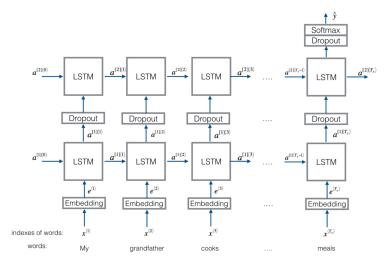


Figure 4: Model architecture example 2

2 Requirements

You are required to implement Sentence-level Sentiment Classification with PyTorch. There are no implementation limits. All parts of implementation depend on you. (e.g. types of rnn, number of layers/units, loss, optimizer...) You are encouraged to use techniques such as bidirectional, dropout and attention, to improve the accuracy. You need to submit all codes and a report with the following requirements:

- Illustrate your network architecture with words and figures in your report.
- Show your best results in your report. (This is a must)
- (Some suggestion to enrich your report) Show your hyper-parameters/ plot the training loss curve/ plot validation accuracy curve in the report.

3 Attention

- You need to submit all codes and a report (at least two pages in PDF format).
- Do not paste a lot of codes in your report.
- Plagiarism (from the internet) is not permitted.