NLP Exercise 2: Aspect-Based Sentiment Analysis

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1 Introduction

The goal of this exercise is to implement a classifier to predict aspect-based polarities of opinions in sentences. The classifier assigns a polarity label to every triple <aspect_category, aspect_term, sentence>. The polarity labels are: positive, negative and neutral.

An example of a (small) dataset containing only 2 instances

negative	SERVICE#GENERAL	Wait staff	0:10	Wait staff is blantently unappreciative of your business but its the best pie on the UWS!
positive	FOOD#QUALITY	pie	74:77	Wait staff is blantently unappreciative of your business but its the best pie on the UWS!

Each line contains 5 tab-separated fields: the **polarity** of the opinion, the **aspect category** on which the opinion is expressed, a specific **target term**, the **character offsets** of the term (*start:end*), and the **sentence** in which that opinion is expressed.

For instance, in the first line the opinion about the **SERVICE#GENERAL** aspect, which is associated to the term "wait staff", is negative.

In the example of the second line, the sentence is the same but the opinion is about a different aspect and a different target term, and is *positive*.

There are 12 different aspects categories:

AMBIENCE#GENERAL
DRINKS#PRICES
DRINKS#QUALITY
DRINKS#STYLE_OPTIONS
FOOD#PRICES
FOOD#QUALITY
FOOD#STYLE_OPTIONS
LOCATION#GENERAL
RESTAURANT#GENERAL
RESTAURANT#MISCELLANEOUS
RESTAURANT#PRICES
SERVICE#GENERAL

The training set has this format (5 fields) and contains 1503 lines, i.e. 1503 opinions.

File: traindata.csv

The classifier should be learned only from this training set.

A development dataset is distributed to help you set up your classifier and assess its performance. It has the same format as the training dataset.

File: devdata.csv (376 lines, i.e. 376 opinions).

We will perform the final evaluation by measuring the accuracy of your classifier on a test dataset that is not distributed. The majority class of the dev set is about 70% (*positive* labels), and will be used as a baseline.

2 How to proceed

- 1. Install and use **python >= 3.8.x** (required). Besides the standard python modules, you can use the following:
 - a. PyTorch >= 1.10.0
 - b. HuggingFace transformers, version 4.16.x.
 - c. scikit-learn >=0.24.0
 - d. pandas \geq 1.3.0
 - e. nltk >= 3.6.0
 - f. gensim >= 4.1.2
 - g. stanza == 1.3.0
- 2. You can work on the project in groups of 4 max.
- 3. Download the **exercise2.zip** file and uncompress it to a dedicated root folder. The root folder will contain 3 subfolders:
 - a. data: contains traindata.csv and devdata.csv
 - b. src: contains 2 python files: tester.py, classifier.py
 - c. resources: (empty) where you can put your resource files if needed
- 4. Implement your classifier by completing the "Classifier" class template in src/classifier.py, containing the following 2 methods:
 - a. The **train** method takes a training data file as input and trains the model
 - b. The **predict** method takes a data file (e.g. devdata.csv) and should return a python list of predicted labels. The returned list contains the predicted labels in the same order as the corresponding examples in the input file
- 5. You can create new python files in the src subfolder, if needed to implement the classifier.
- 6. You can train your model using gpu (assume max gpu memory == 11GB)
- 7. To check and test your classifier, **cd to the src subfolder** and **run tester.py**. It should run without errors, training the model on traindata.csv and evaluating it on devdata.csv, and reporting the accuracy measure.
- 8. Please do not modify tester.py! Your program must run successfully without having to modify this file.
- 9. The exact content of the deliverable is described in section 3 of this document

- 10. Your project deliverable must be a unique **zip** file (a compressed folder). No gz, or other compression format.
- 11. The **name of the zip file** must consist of the family names of the authors of the deliverable. Example: Clouseau_Holmes_Velasquez.zip
- 12. The zip file size should not exceed 3 MBs.
- 13. Send the zip file by email to: salah.ait-mokhtar@naverlabs.com

3 Deliverable Content

When uncompressed, the main folder must contain the following elements:

Element	Description
README.txt	 A plain text file that should contain a couple of paragraphs describing: 1. Names of the students who contributed to the deliverable (max=4) 2. A couple of paragraphs describing your final system (type of classification model, feature representation, resources etc.) 3. The accuracy that you get on the dev dataset.
resources	(optional): containing specific resources if used (e.g. polarity lexicons)
src	A subfolder containing ALL the python source files required to train and run your classifier using the unmodified tester.py : this file is used to run and evaluate your classifier.

Note:

- Please make sure that when you cd to the src subfolder and launch tester.py

 (unmodified!) with the python interpreter, it runs without errors: it trains the classifier on the train set and evaluates it on the dev dataset, outputting the average accuracy.
- You can use any type of models, including non-deep models. However, note that classification methods based on pre-trained, transformer-based language models usually yield better accuracy.
- You can also use deep models enriched with explicit or implicit linguistic features: lemmatization, shape, POS tags, and/or parsing dependency relations using the stanza parser (c.f. lecture on parsing), polarity lexicons, etc.