```
 1 import string
 2 import os
 3 import json
 4
 5
 6 # ------------------------------------------------- load file
    -------------------------------------------------- #
 7
 8 def load_vocab(vocab_path):
 9     vocabs = set()
10     with open(vocab_path) as vocab_file:
11         for word in vocab_file:
12             vocabs.add(word.strip())
13     return vocabs
14
15
16 def save_file(file_content, file_path):
17     with open(file_path, 'w') as file:
18         file.write(file_content)
19
20
21 # ------------------------------------------------ preprocess files
    ------------------------------------------------- #
22
23 def is_punc(char):
24     return char in string.punctuation
25
26
27 def lowercase_sentence(comment: str) -> str:
28     return comment.lower()
29
30
31 def separate_punctuation(comment: str) -> str:
32     res = []
33     for word in comment.split():
34         start = 0 # start index of current separation
35         for i, c in enumerate(word):
36             if is_punc(c):
37                 if start < i:
38                     res.append(word[start: i])
39                 res.append(c)
40                 start = i + 1
41         if start < len(word):
42             res.append(word[start:])
43     return ' '.join(res)
44
45
46 def contains_strong_pos_word(words:list) -> bool:
47     positive_words = {'excellent', 'amazing', 'great', 'fantastic', '
   outstanding', 'terrific', 'phenomenal', 'superb',
48                       'brilliant', 'impressive'}
49     for word in words:
50         if word in positive_words:
51             return True
52     return False
53
54
55 def contains_strong_neg_word(words: list) -> bool:
56     negative_words = {'disappointing', 'terrible', 'awful', 'horrible'
   , 'dreadful', 'abysmal', 'appalling', 'atrocious',
57                       'repulsive', 'disgusting'}
```

```
 58     for word in words:
 59         if word in negative_words:
 60             return True
 61     return False
 62 
 63 
 64 def preprocess_comment(comment: str) -> str:
 65     return separate_punctuation(lowercase_sentence(comment))
 66 
 67 
 68 def preprocess_file(file_path: str) -> str:
 69     with open(file_path) as file:
 70         comment = ' '.join([line.strip() for line in file])
 71         comment = lowercase_sentence(comment)
 72         comment = separate_punctuation(comment)
 73         return comment
 74 
 75 
 76 def build_bag_of_word_vector(comment: str, vocabs: set):
 77     vector = {}
 78     for word in comment.split():
 79         if word in vocabs:
 80             if word in vector:
 81                 vector[word] += 1
 82             else:
 83                 vector[word] = 1
 84     return vector
 85 
 86 
 87 def preprocess_folder(folder_path: str, vocabs):
 88     vector_list = []
 89     for filename in os.listdir(folder_path):
 90         comment = preprocess_file(f'{folder_path}/{filename}')
 91         vector_list.append(build_bag_of_word_vector(comment, vocabs))
 92     return vector_list
 93 
 94 
 95 def preprocess(folder_path1, folder_path2, vocab_path, path1_class,
    path2_class, output_path):
 96     # label######{json format of vector}
 97     # ###### is the separator of column to access easier
 98     vocabs = load_vocab(vocab_path)
 99     folder_path1_vectors = preprocess_folder(folder_path1, vocabs)
100     folder_path2_vectors = preprocess_folder(folder_path2, vocabs)
101 
102     res = []
103     for vector in folder_path1_vectors:
104         res.append(f'{path1_class}#####{json.dumps(vector)}#####{int(
    contains_strong_pos_word(list(vector.keys())))}#####{int(
    contains_strong_neg_word(list(vector.keys())))}')
105     for vector in folder_path2_vectors:
106         res.append(f'{path2_class}#####{json.dumps(vector)}#####{int(
    contains_strong_pos_word(list(vector.keys())))}#####{int(
    contains_strong_neg_word(list(vector.keys())))}')
107     save_file('\n'.join(res), output_path)
108 
109 
110 
```

```
 1 import os
 2 import json
 3 import decimal
 4
 5 from pre_process import preprocess_comment, preprocess,
   preprocess_file
 6
 7
 8 # ------------------------------------------------- load file
    -------------------------------------------------- #
 9
10 def load_vocab(vocab_path) -> set:
11     vocabs = set()
12     with open(vocab_path) as vocab_file:
13         for word in vocab_file:
14             vocabs.add(word.strip())
15     return vocabs
16
17
18 def save_model(file_content, file_path):
19     with open(file_path, 'w') as file:
20         json.dump(file_content, file)
21
22
23 def save_file(file_content, file_path):
24     with open(file_path, 'w') as file:
25         file.write(file_content)
26
27
28 def load_json(file_path: str) -> dict:
29     with open(file_path) as file:
30         return json.load(file)
31
32
33 def load_one_vector(vector_file_path: str) -> dict:
34     return load_json(vector_file_path)
35
36
37 def load_naive_bayes_classifier(classifier_path: str) -> dict:
38     return load_json(classifier_path)
39
40
41 # ---------------------------------------- train naive bayes
   classifier ----------------------------------------- #
42
43 def initialize_counter(vocabs) -> dict:
44     '''
45     load vocab and build  a dictionary that contains all vocab as key
   , and value set to 0
46     :return: a dictionary that contains all vocab as key, and value
   set to 0
47     '''
48
49     return {vocab: 0 for vocab in vocabs}
50
51
52 def preprocessed_file_decoder(training_file_path: str):
53     with open(training_file_path) as file:
54         line = file.readline()
55         while line:
56             line = line.rstrip('\n')
```

```
 57             line = line.split('#####')
 58             yield line[0], json.loads(line[1]), bool(line[2]), bool(
    line[3])
 59             line = file.readline()
 60
 61
 62 def aggregate_vector_into_counter(counter: dict, vector: dict,
    class_type, contains_strong_pos_word, contains_strong_neg_word):
 63     total_token = 0
 64     for word, freq in vector.items():
 65         counter[word] += freq
 66         total_token += freq
 67
 68     if class_type == 'pos' and contains_strong_pos_word or class_type
     == 'neg' and contains_strong_neg_word:
 69         for word, freq in vector.items():
 70             counter[word] += 100
 71             total_token += 100
 72     else:
 73         for word, freq in vector.items():
 74             if counter[word] > 100:
 75                 counter[word] -= 100
 76                 total_token -= 100
 77             else:
 78                 total_token -= counter[word]
 79                 counter[word] = 0
 80     return total_token
 81
 82
 83 def train_naive_bayes_class_recognizer(counter: dict, total_token:
    int) -> dict:
 84     recognizer = {}
 85     total_vocab = len(counter)
 86     add_one_smoothing_total_token = total_vocab + total_token
 87     for word, freq in counter.items():
 88         recognizer[word] = (freq + 1) / add_one_smoothing_total_token
 89     return recognizer
 90
 91
 92 def naive_bayes(training_file_path, result_model_path, vocab_path=""
    , class_1="pos", class_2="neg"):
 93     vocabs = load_vocab(vocab_path)
 94     counter = {
 95         class_1: {
 96             'counter': initialize_counter(vocabs),
 97             'total_token': 0,
 98             'class_recognizer': None,
 99             'prior_prob': 0
100         },
101         class_2: {
102             'counter': initialize_counter(vocabs),
103             'total_token': 0
104         },
105     }
106
107     for class_type, vector, contains_strong_pos_word,
    contains_strong_neg_word in preprocessed_file_decoder(
    training_file_path):
108         counter[class_type]['total_token'] +=
    aggregate_vector_into_counter(counter[class_type]['counter'],
109
```

```
109         vector,
110 
            class_type,
111 
            contains_strong_pos_word,
112 
            contains_strong_neg_word
113 
            )
114 
115     total_token = counter[class_1]['total_token'] + counter[class_2][
    'total_token']
116     naive_bayes_classifier = {class_1:
    train_naive_bayes_class_recognizer(counter[class_1]['counter'],
117 
         counter[class_1]['total_token']
118 
         ),
119                               class_2:
    train_naive_bayes_class_recognizer(counter[class_2]['counter'],
120 
         counter[class_2]['total_token']
121 
         ),
122                               f'{class_1}_prior': counter[class_1]['
    total_token'] / total_token,
123                               f'{class_2}_prior': counter[class_2]['
    total_token'] / total_token,
124                               "class_1": class_1,
125                               "class_2": class_2
126                               }
127 
128     save_model(naive_bayes_classifier, result_model_path)
129     return naive_bayes_classifier
130 
131 
132 # ------------------------------------------------ evaluate test data
     ------------------------------------------------ #
133 
134 def compute_prob(comment: str | list, class_recognizer: dict,
    prior_prob: float) -> decimal.Decimal:
135     if type(comment) is str:
136         comment = comment.split()
137 
138     # the min of a float is around 1e-310, it's very likely to have
    the prob of the sentence less than this
139     prob = decimal.Decimal(prior_prob)
140     for word in comment:
141         if word not in class_recognizer:
142             continue
143         prob = prob * decimal.Decimal(class_recognizer[word])
144     return prob
145 
146 
147 class NaiveBayesClassifier:
148     def __init__(self, path_to_model="", model=None):
149         self.model = model
150         self.class_1 = None
151         self.class_2 = None
152         if not model and path_to_model:
153             self.load_model(path_to_model)
```

```
154
155     def load_model(self, path_to_model: str):
156         with open(path_to_model) as model_file:
157             self.model = json.load(model_file)
158             self.class_1 = self.model["class_1"]
159             self.class_2 = self.model["class_2"]
160
161     def classify(self, comment: str):
162         comment = preprocess_comment(comment)
163         word_list = comment.split()
164         class_1_prob = compute_prob(word_list, self.model[self.
    class_1], self.model[f"{self.class_1}_prior"])
165         class_2_prob = compute_prob(word_list, self.model[self.
    class_2], self.model[f"{self.class_2}_prior"])
166
167         # print(self.class_1, "probability is", class_1_prob)
168         # print(self.class_2, "probability is", class_2_prob)
169
170         return self.class_1 if class_1_prob > class_2_prob else self.
    class_2
171
172
173 # ---------------------------------------- main (training and
    evaluate) ---------------------------------------- #
174
175 # Train a classifier use a small corpus
176 def problem_2b():
177     preprocess(folder_path1="./data/movie_review_small/action",
178                folder_path2="./data/movie_review_small/comedy",
179                vocab_path="./data/movie_review_small/
    movie_review_small.vocab",
180                path1_class="action",
181                path2_class="comedy",
182                output_path="./preprocessed/movie_review_small.txt"
183                )
184
185     naive_bayes(training_file_path="./preprocessed/movie_review_small
    .txt",
186                 result_model_path="models/movie_review_small.NB",
187                 class_1="action",
188                 class_2="comedy",
189                 vocab_path="./data/movie_review_small/
    movie_review_small.vocab",
190                 )
191
192
193 def problem_2c():
194     comment = "fast, couple, shoot, fly"
195     naive_bayes_classifier = NaiveBayesClassifier(path_to_model='
    models/movie_review_small.NB')
196     class_estimation = naive_bayes_classifier.classify(comment)
197
198     print(f"Class of sentence {comment} is: {class_estimation}")
199
200
201 def problem_2d():
202     # preprocess training data and train model
203     preprocess(folder_path1="./data/train/pos",
204                folder_path2="./data/train/neg",
205                vocab_path="./data/imdb.vocab",
206                path1_class="pos",
```

```
207                 path2_class="neg",
208                 output_path="./preprocessed/movie_review_BOW.txt"
209                 )
210 
211     naive_bayes(training_file_path="./preprocessed/movie_review_BOW.
    txt",
212                  result_model_path="./models/movie_review_BOW.NB",
213                  class_1="pos",
214                  class_2="neg",
215                  vocab_path="./data/imdb.vocab",
216                  )
217 
218     naive_bayes_classifier = NaiveBayesClassifier(path_to_model='./
    models/movie_review_BOW.NB')
219     pos_test_folder = './data/test/pos'
220     neg_test_folder = './data/test/neg'
221     pos_test_files = os.listdir(pos_test_folder)
222     neg_test_files = os.listdir(neg_test_folder)
223 
224     result = []  # [[estimation, comment],...]
225     incorrect = []
226     total_est = len(neg_test_files) + len(pos_test_files)
227 
228     for file in pos_test_files:
229         comment = preprocess_file(file_path=f'{pos_test_folder}/{file
    }')
230         class_est = naive_bayes_classifier.classify(comment)
231         result.append(f'{class_est}    {comment}')
232         if class_est != 'pos':
233             incorrect.append(f'{class_est}    {comment}')
234 
235     for file in neg_test_files:
236         comment = preprocess_file(file_path=f'{neg_test_folder}/{file
    }')
237         class_est = naive_bayes_classifier.classify(comment)
238         result.append(f'{class_est}    {comment}')
239         if class_est != 'neg':
240             incorrect.append(f'{class_est}    {comment}')
241 
242     accuracy = (total_est - len(incorrect)) / total_est
243     result.append(f'Accuracy: {accuracy}    Total Estimations: {
    total_est}    Incorrect Estimations: {len(incorrect)}')
244     save_file('\n'.join(result), './report.txt')
245     save_file('\n'.join(incorrect), './incorrect.txt')
246 
247 problem_2d()
248 
249 
```