YouTube comment sentiment analysis with web interface

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Abstract—We have created a webservice that performs sentiment analysis on YouTube videos using the Google Data APIs, by using a self combined corpus and a trained simple machine learning classifier

I. Introduction

This paper showcases the results of a project, analyzing YouTube comments using Python.

It describes the methods and techniques used to create the analysis and discusses the paths taken as well as further potential work to be done.

II. METHODS

We have divided the project into classes specific for the different areas our project encompasses: a youtube scraper, a sentiment analyser and a webservice.

A. Webservice

For the webservice we use the Flask [1] using the Jinja2 [2] templating engine, this allows us to separate the code from the markup.

We also used Javascript and SASS [3], to a lesser degree for the frontend development of the webservice.

While developing we have used the built-in flask web server for ease of use, for deployment however, a traditional web server like Apache with mod_fastcgi would probably be the better option for its performance and security.

B. Sentiment analyser

The sentiment analyser is based on the NLTK package [4]. We train a Naive Bayes classifier and saves the classifier as a pickle file, so we next time don't have to train, but simply load the classifier into NLTK.

The classifier is trained based on a combined corpus of tweets from Twitter [5] and movie reviews [6].

The corpus has been pre-prossesed so there is equal number of positive and negative texts - 13333 each. The hashtags and user-specified tags ('@'-tag) has also been removed from the twitter corpus. Reversed, there has been added a few emoticons like ':D' and ':(' (positive and negative respectively).

The sentiment analysis itself, is done by a method which takes the comments as input and do sentiment analysis on all of them. Then it's finding a overall classification of the video by making a majority vote of the comments sentiment. The classification can be one of five possibillities: Strong negative, slight negative, neutral, slight positive or strong positive.

C. YouTube scraper

The YouTube scraper uses the Google Data API's for fetching data from youtube and requests as the library making the HTTP requests. We realize a python gdata module already exists,

D. General

The project runs Python 3 and have not been tested on Python 2, however all external libraries we use has a Python 2 equivalent. The only real hurdle for compatibility would be the difference in the Python Standard Library.

In the beginning of the project we simply used the sqlite [7] module for communication with the database, however we later realized this was cumbersome because we had to manually write functions for inserting all the scraped information into the database, we decided to switch to the sqlalchemy object relational mapper [8] for database communication. By using an ORM we saved time and could do database transactions in an easy way using our specified models.

Behind the sqlalchemy ORM we use the sqlite database, as it allows for fast prototyping, Figure 2 shows an ER diagram for the database schema.

Code listings can be found in the listings section.

III. RESULTS

Figure 1 shows a screenshot of the webservice with a sentiment analysis analysis of a YouTube video.

A. Sentiment analysis

Our sentiment analysis showed an accuracy of 68.58%, which is decent. This result is based on a test-set and by using util.accuracy in the NLTK package.

The training of the classifier is taking some time. This time is way too long if it should train every time (approx. 40 minutes). This is touched upon further in the Discussion section.

B. Code checking

For syntax and static checking we used flake8[9], a wrapper of pyflakes and pep8, we also used pylint[10] and pep257[11]. We integrated these checks as a part of our testing so we could quickly assess if our code was sound. In addition to checking our code we also checked our tests.

C. Testing

For testing we primarily used the python unittest library in combination with nose [12], we used coverage [13] for code coverage making sure we had a test coverage of 100%. As written above we integrated the flake8 and pylint checking into the tests. We used both unit-testing and integration testing in testing the various components in our project. We have divided the tests into several files where each test file corresponds to a module and one for the code checking tests.

D. Profiling

We have not analysed the project by profiling but we estimate the HTTP requests and the classification performed will be the bottleneck. This is touched upon further in the Discussion section.

IV. DISCUSSION

As our sentiment corpus consists of words in english, the sentiment analysis will only work for English texts.

As the webservice makes use of the Google Data APIs it has to make several HTTP GET requests for fetching comments, right now 1 request for every 25 comments, this serves as a bottleneck for analysing YouTube videos with large amounts of comments. Because of this bottleneck it results in a delay for the user the first time a new video is analysed, however subsequent requests on the particular video will fetch the information from the database eliminating the delay. The database fetch happens only if the number of comments for the video are unchanged from the last analysis. Further work could be spent looking into optimizing the HTTP requests made for example by parallelization of the requests. The classification also take up a considerable amount of time and further time could be spent optimizing this as well. Profiling the project could be done using the cProfile module[14].

As mentioned earlier, the training of the classifier is taking too long. As we saves the classifier, so we next time just can load it, it's something we can live with.

By reducing the corpus, we can cut down the training time. But this will affect the accuracy of the classifier. So it's a trade-off issue. As we don't know exactly how much the trade-off is and how much of the corpus we can cut-off before the accuracy of the classifier is decreasing too much, this is an area to look into the next step to go for optimizing the sentiment analysis.

V. CONCLUSION

We have implemented a YouTube sentiment web service mining YouTube comments and performing sentiment analy-

By using a simple Naive Bayes classifier and relative big corpus, we obtained a decent accuracy of 68.58%

Due to the nature of the service and restrictions in the Google Data APIs it works best with a small number of comments, however we mediate it somewhat by saving the results to a local database.

REFERENCES

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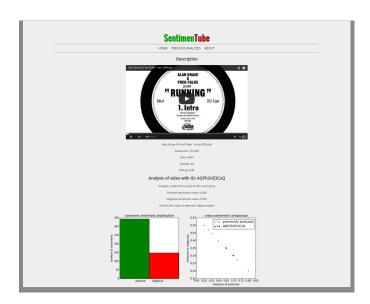


Figure 1. Result of sentiment analysis of YouTube video

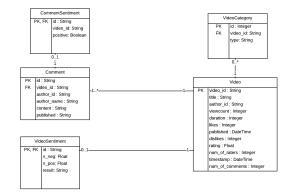


Figure 2. Database schema

APPENDIX A CODE LISTINGS

LISTINGS

	/sentimentube/youtube.py
	/sentimentube/sentiment_analysis.py
	/sentimentube/webserve.py
	/sentimentube/models.py
	/sentimentube/database.py
	/test/test_flask.py
	/test/test_youtube.py
	/test/test_sentiment_analysis.py
	/test/test_codeformat.py
1	#!/usr/bin/env python3
	# -*- coding: utf-8 -*-
3 4	# pylint: disable=R0201 """_This_module_scrapes/download_contents_from_a_youtube_video"""
5	import requests
6	import dateutil.parser
7	import logging
8	import datetime
0	import models
1	
2	1 V 7 1 0
3	class YouTubeScraper:
5	""" LClass L for Lcommunicating Lwith Lthe Lgdata Lyoutube LAPI . L"""
6	
7	<pre>definit(self): """</pre>
8	self.comment_url = "https://gdata.youtube.com/feeds/api/videos/{0}/"
0	"comments"
1	<pre>self.video_url = "https://gdata.youtube.com/feeds/api/videos/{0}"</pre>
23	self.logger = logging.getLogger(name)
.s !4	<pre>def _comment_generator(self , video_id):</pre>
25	"""
6	uuuuuuuAugeneratoruforufetchinguoneu"page"uofuyoutubeucomments.
.7 .8	For_alyoutube_video, _it_returns_allist_of_comment_dictionaries
9	with_keys:_author_name,_author_id,_content,_video_id,_id,_published
0	It_should_not_becaused_directly , _it_is_private_and_the_fetch_comments
1	upububumethod ushould ubeuused uinstead.
3	Parameters:
4	uuuuuuu-uvideo_idu:utheuiduofutheuyoutubeuvideo
5	"""
6 7	<pre>next_url = self.comment_url.format(video_id) params = {"v": 2, "alt": "json", "max-results": 50,</pre>
8	"orderby": "published"}
9	, ,
0	while True:
1	<pre>if next_url: try:</pre>
3	response = requests.get(next_url, params=params)
4	except requests.exceptions.RequestException:
5	<pre>self.logger.exception("_comment_generator:_request_failed") raise</pre>
6 7	else:
8	if not response:
9	error = "_comment_generator: uinvalid uvideo uid: u" \
0 1	"{}".format(video_id) self.logger.error(error)
2	raise ValueError(error)
3	response = response.json()
4	else:
5 6	raise StopIteration comments = []
7	if "entry" not in response ["feed"]:
8	raise RuntimeError("no_comments_for_video")
9	for comment in response ["feed"] ["entry"]:
60 51	<pre>author_name = comment["author"][0]["name"]["\$t"] author_id = comment["author"][0]["yt\$userId"]["\$t"]</pre>
2	content = comment["content"]["\$t"]
3	comment_id = comment["id"]["\$t"]
4	<pre>published = dateutil.parser.parse(comment["published"]["\$t"])</pre>

```
66
                                         comment = models.Comment(id=comment id.
 67
                                                                                           video_id=video_id,
 68
                                                                                           author_id=author_id,
 69
                                                                                           author\_name = author\_name ,
 70
71
72
73
74
75
76
77
78
                                                                                           content=content,
                                                                                           published=published)
                                         comments\,.\,append\,(\,comment\,)
                                 if next_url:
                                         next\_url = next\_url[0]
                                  yield comments
 79
 80
                 def fetch_comments(self, video_id, number=0):
 81
 82
         \verb| lumberlofly out ubell commentslusing | \verb| lumberlofly out ubell commentslusing | \verb| lumberlofly out ubell commentslusing | lumberl
 83
 85
         ____video_id_: _the _id_of_the _youtube_video
 86
         ____number_: _the _number_of_comments_to_fetch_(0_=_all_comments)
 87
 88
         ____list_of_Comment_objects
 89
 90
 91
                         comments = []
 92
                         fetch = self._comment_generator(video_id)
 93
                          while True:
                                 try:
 95
                                         comments += next(fetch)
  96
                                          if len(comments) > number and number > 0:
 97
                                                 return comments[:number]
                                 except StopIteration:
 99
                                         return comments
100
101
                 def fetch_videoinfo(self, video_id):
102
103
         ____fetch_relevant_information_about_the_video_from_the_gdata_youtube_API.
104
105
         Parameters:
         \verb"luculus"-uvideo_idu: \verb"ltheuiduof" theuyoutubeuvideo" \\
106
107
108
           .....Returns:
         ____tuple_of_Video_object_and_list_of_Category_objects
109
110
                        req = requests.get(self.video_url.format(video_id),
params={"v": 2, "alt": "json"})
111
112
113
                         if not req:
                                 self.logger.error("fetch_videoinfo:_invalid_video_id")
114
                                 raise ValueError("invalid_video_id")
115
116
117
                         req = req.json()
                         comment_permission = [entry["permission"] for entry in
118
                                                                     req["entry"]["yt$accessControl"] if
entry["action"] == "comment"][0]
119
120
121
                          if comment_permission == "denied":
122
                                  self.logger.error("fetch_videoinfo: \( \)comments\( \)disallowed\( \)for\( \)video")
123
124
                                 \textbf{raise} \quad Runtime Error ("Comments\_disallowed\_for\_video\_\{0\}". \textbf{format} (
125
126
                                          video_id))
127
128
                          video = self.extract_video(req, video_id)
129
                          categories = self.extract_categories(req, video_id)
130
                         return video, categories
131
132
                  def extract_categories(self, req, video_id):
133
134
         ____extract_categories_from_a_json-converted_gdata_video_HTTP_response.
135
136
137
         ____req_: the _gdata_video _HTTP_response
138
         ___video_id: _the _youtube _video_id
139
         ____Returns:
         ____list_of_Category_objects
140
141
         ------
142
                         categories = req["entry"]["media$group"]["media$category"]
                         categories = [models. VideoCategory(type=category["$t"],
143
144
                                                                                               video_id=video_id)
145
                                                     for category in categories]
146
                         return categories
```

```
148
           def extract_video(self, req, video_id):
149
150
             . __extract_video_object_from_a_json-converted_gdata_video_HTTP_response_
151
152
      ____Parameters:
153
      \verb"luculus"-ureq": \verb"ltheugdatauvideou" HTTP\_response"
154
      \verb"uuuuuu"-uvideo_id": \verb"theuyoutubeuvideo_id"
155
      LLLLLL Returns:
      __a_Video_object
156
157
158
                rating, numraters = None, None
                if "gd$rating" in req["entry"]:
    rating = req["entry"]["gd$rating"]["average"]
    numraters = req["entry"]["gd$rating"]["numRaters"]
159
160
161
                likes, dislikes = None, None
if "yt$rating" in req["entry"]:
    likes = req["entry"]["yt$rating"]["numLikes"]
    dislikes = req["entry"]["yt$rating"]["numDislikes"]
162
163
164
165
166
167
                title = req["entry"]["title"]["$t"]
                author_id = req["entry"]["author"][0]["yt$userId"]["$t"]
viewcount = req["entry"]["yt$statistics"]["viewCount"]
duration = req["entry"]["media$group"]["media$content"][0]["duration"]
168
169
170
171
                published = dateutil.parser.parse(req["entry"]["published"]["$t"])
                num_of_comments = \
    req["entry"]["gd$comments"]["gd$feedLink"]["countHint"]
172
173
174
                video = models. Video (id=video_id,
175
                                           title = title,
176
                                           author_id=author_id,
177
                                           viewcount=viewcount,
178
                                           duration=duration,
179
                                           published=published,
180
                                           rating=rating,
181
                                           num_of_raters=numraters,
182
                                           likes=likes,
183
                                           dislikes = dislikes,
184
                                           num_of_comments=num_of_comments,
185
                                           timestamp=datetime.datetime.now())
186
                return video
187
           _name__ == '__main__':
YOU = YouTubeScraper()
188
189
           print(YOU.fetch_comments("wrong_url"))
190
      #!/usr/bin/env python3
 2
      # -*- coding: utf-8-
  3
      # pylint: disable=R0201
      Module_for_sentiment_analysis.
      This_module_has_3_purposes:
      1: Can load an existing classifier from a pickle file
      2: Train Land Lsave Lau classifier Lto Laupickle Lfile
      3: Can_classify_multiple_comments_objects_(from_a_list)_and_deduct_an_overall
       ___classification_of_the_video
 12
      The _comments_object , _is_the _comments_from_the _youtube_video_which_want_to_be
 13
      classified.
 14
 15
 16
     import nltk.classify.util
 17
      import pickle
 18
      import os
 19
      import logging
20
      import models
 21
      from nltk.corpus import stopwords
     CUSTOM_STOP_WORDS = ['band', 'they', 'them']
23
24
25
      \boldsymbol{def} \ \ create\_word\_list(text\_words\_tuples) \colon
26
27
      Create_a_big_set_with_ALL_of_the_words_from_the_corpus.
28
      \verb"uuuu": paramutext\_words\_tuples: \verb"uTupleuw" ith \verb"uallutext" und \verb"utheirus" entiments
29
30
      ___:return_words_list:_The_big_set_with_all_the_words
31
32
           words_list = set()
 33
           for (words, _) in text_words_tuples:
    for word in words:
 34
 35
                     words_list.add(word.lower())
36
           return words_list
37
38
      def create_tagged_text(tuples):
```

```
41
     ____Create_a_list_of_tuples_containing_words_of_the_text_and_its_sentiment.
42.
43
     ___:param_tuples:_Tuples_with_text_(as_strings)_and_its_sentiment
44
     ___:return_tuples_text:_The_list_of_tuples
45
46
         tuple_text = []
         stop = stopwords.words('english')
47
48
         for (text, sentiment) in tuples:
49
              words = text.split()
50
             clean_word = ([i.lower() for i in words
51
                              if not i.lower() in stop])
52
53
54
             tuple_text.append((clean_word, sentiment))
         return tuple_text
55
56
     class SentimentAnalysis:
57
58
         """ LClass L for L making L sentiment L analysis L of L video L comments . L """
59
         def __init__(self, file_name):
60
61
                 _Call_the_load_method_to_load_the_classifier_from_file ._"""
              corpus_path = "data/corpus.txt"
62
              self.logger = logging.getLogger(__name__)
64
              _, self.word_list = self.create_words_and_tuples(corpus_path)
              self.file_path = os.path.join(os.path.dirname(__file__), file_name)
66
              self.classifier = self.load_classifier(corpus_path)
67
68
         def load_corpus(self, file_name, split=","):
70
     ____Load_corpus_from_file_and_stores_it_in_a_tuple.
71
     ____param_file_name: _Name_of_the_corpus_file
73
     :param_split:_How_to_split_a_line_in_the_corpus_(text_vs._sentiment).
74
     ____Default_split:_
75
     \verb"aucusus": return: \verb"upt" \verb"and" \verb"unt: \verb"uRespectively" \verb"upositive" \verb"and" \verb"unegative" \verb"utuple" |
76
     continued (text, sentiment)
77
78
             self.logger.debug("Loading_corpus_file")
79
             file_path = os.path.join(os.path.dirname(__file__), file_name)
80
             try:
                  with open(file_path, 'r') as read_file:
81
                      lines = read_file.readlines()[1:]
82
             except(FileExistsError, LookupError):
    self.logger.error("I/O_error:_corpus_file_not_found")
83
84
85
                  raise
86
              else:
                  sentiment_dict = {0: "negative", 1: "positive"}
87
                  return [(line.split(split)[1].strip(),
88
89
                            sentiment_dict[int(line.split(split)[0])])
90
                           for line in lines]
91
92
         \boldsymbol{def} \ \_word\_feats\_extractor(self \ , \ doc) :
93
94
     \verb""extract" features "from" corpus".
95
96
     ____: param_words: _List_of_words_from_corpus
97
     ____:return:_Dict_of_the_words_as_keys_and_True/False_as_values
98
99
             doc words = set(doc)
             return dict([("contains({}))".format(i), i in doc_words)
100
101
                            for i in self.word_list])
102
103
         def create_words_and_tuples(self, corpus_filename):
104
105
     \verb"list". I and \verb"list" and \verb"list" and \verb"list" and \verb"list" and \verb"list".
106
107
     \verb"lucus" tagged \verb"lext " is " the \verb"words" of " the \verb"lext" and " their " sentiment",
108
     ____word_list_is_the_words_in_the_corpus
109
110
     ____:param_corpus_filename: _the_filepath_of_the_corpus
111
112
             text = self.load_corpus(corpus_filename, ";")
113
             tagged_text = create_tagged_text(text)
              word_list = create_word_list(tagged_text)
114
              return tagged_text, word_list
115
116
117
         def _train(self, corpus_filename):
118
119
     ____Train_the_classifier.
120
121
     Training the Naïve_Bayes_classifier, by_calling the following methods:
    ___load_corpus
```

.....

```
123
         __create_tagged_text
124
         ____create_word_list
125
         word_feats_extractor
126
127
                        tagged_text , _ = self.create_words_and_tuples(corpus_filename)
128
129
                        self.logger.debug("Making_training_set_(apply_features)...")
130
131
                        training_set = nltk.classify.apply_features(
132
                                self._word_feats_extractor, tagged_text)
133
134
                         classifier = nltk.NaiveBayesClassifier.train(training_set)
135
                         self._save_classifier(classifier)
136
                        return classifier
137
138
                 def _save_classifier(self, classifier):
139
140
         ____Save_the_classifier_to_a_pickle_file.
141
142
         \verb"lucus": paramuclas sifier: \verb"lThe" traineduclas sifier"
143
144
145
                                file_open = open(self.file_path, 'wb')
146
                                pickle.dump(classifier, file_open, 1)
147
                                file_open.close()
148
                                self.logger.info("Classifier_saved_successfully!")
149
                        except IOError:
                                self.logger.debug("Couldn't_save_the_classifier_to_pickle")
150
151
152
                 def load_classifier(self, corpus_path):
153
154
         ____Load_a_trained_classifier_from_file.
155
156
         _____If_it_fails , _it's_training_a_new
157
158
                        trv:
                                classifier = nltk.data.load(
   "file:"+self.file_path, 'pickle', 1)
159
160
161
                                self.logger.info("Classifier_loaded!")
                                return classifier
162
                        except (FileExistsError, LookupError):
    self.logger.error("I/O_error:_classifier_file_not_found")
163
164
                                self.logger.info("Will_train_a_classifier")
return self._train(corpus_path)
165
166
167
168
                 def classify_comments(self, comments):
169
         ____Classify_youtube-videos_comments.
170
171
         ____performs_classification_on_each_comment
172
173
         uuuuuuuanduletutheumethodu'eval'umakeuaudecision
         \verb"lumberlofl" positive landline gative lcomments in the control of the control 
174
175
         ____before_calling_the_'eval'_method
176
         \verb"-comments": \verb-The--comments": \verb-The--comments": \verb-The--comments": \verb-The--comments = \verb-of--youtube--video
177
         ....: return:
178
179
                        video_sentiment = models. VideoSentiment(id=comments[0]. video_id,
                                                                                                    n_pos=0, n_neg=0, result="")
180
181
                        self.logger.info(
   "There_is_a_change_in_comments._We_do_sentiment_analysis")
182
183
184
                         comments_sentiment = []
185
                        for comment in comments:
186
                                res = self.classifier.classify(self._word_feats_extractor(
187
                                       comment.content.split()))
188
189
                                if res == "pos":
190
                                        video_sentiment.n_pos += 1
191
                                        comments_sentiment.append(models.CommentSentiment(
192
                                               id=comment.id , video_id=comment.video_id , positive=1))
193
194
                                        video_sentiment.n_neg += 1
195
                                        comments_sentiment.append(models.CommentSentiment(
196
                                               id=comment.id , video_id=comment.video_id , positive=0))
197
198
                         total_data = video_sentiment.n_pos + video_sentiment.n_neg
199
                         self.logger.debug("Number_of_negative_comments: _%d",
200
                                                           video_sentiment.n_neg)
                         self.logger.debug("Number_of_positive_comments: _%d",
202
                                                           video_sentiment.n_pos)
203
204
                         video_sentiment.n_pos /= total_data
                         video_sentiment.n_neg /= total_data
```

```
self.logger.debug("NumberLofLnegativeLcommentsLafterL"
206
207
                                                                                  'normalization: _%.2f", video_sentiment.n_neg)
208
                                  self.logger.debug(
209
                                             "Number_of_positive_comments_after_normalization:_%.2f",
210
                                            video_sentiment.n_pos)
211
212
                                  video_sentiment.result = self._eval(video_sentiment)
213
                                  self.logger.info("The_result_of_the_video: _%s",
214
                                                                             video_sentiment.result)
215
                                 return video_sentiment, comments_sentiment
216
217
                       def _eval(self , video_sentiment):
218
219
             \verb"liment" cof \verb|| the \verb||| over all \verb||| sentiment \verb||| of \verb||| the \verb||| youtube \verb||| video .
220
221
             \verb"limentlof" Label a line a 
222
            ____based_on_the_ratio_between_positive_and_negative_comments
223
            _____It_takes_a_decision_like_so,_based_on_number_positive_comments_(nPos):
224
             ____Nos_<0.25:____Strong_negative
225
            ____Nos_>=_0.25_and_nPos <__0.4:____Slight_negative
226
            ___nPos_>=_0.4_and_nPos_<_0.6:____Neutral
227
            ____Slight_positive
228
            uuuuuuuuu-uuunPosu>=u0.75:uuuStrongupositive
            ____:param_video_sentiment:
229
230
            ____:return:
231
            _____
                                 if video_sentiment.n_pos < .25:
232
233
                                           res = "strong_negative
                                 elif video_sentiment.n_pos >= .25 and video_sentiment.n_pos < .4:
    res = "slight_negative"</pre>
234
                                 elif video_sentiment.n_pos >= .4 and video_sentiment.n_pos < .6:
    res = "neutral"</pre>
236
                                 elif video_sentiment.n_pos >= .6 and video_sentiment.n_pos < .75:
    res = "slight_positive"</pre>
240
                                  else:
241
                                            res = "strong_positive"
242
243
                                 return res
            #!/usr/bin/env python3
            # -*- coding: utf-8 -*-
    2
    3
   4
            Flask_app_for_webservice.
             handles \verb| | the \verb| | interacting \verb| | between \verb| | the \verb| | user \verb| | and \verb| | the \verb| | system |.
    8
            from matplotlib.backends.backend_agg import FigureCanvasAgg as FigureCanvas
  10
            from matplotlib.figure import Figure
            import io
            import urllib
  12
            import urllib.parse
            import logging
            import sqlalchemy
  17
            import database
  18
            import models
            import sentiment_analysis
            import youtube
 21
             logging.basicConfig(format="%(asctime)s_%(message)s", level=logging.DEBUG)
 23
            LOGGER = logging.getLogger(__name__)
 24
 25
             ANALYZER = sentiment_analysis. SentimentAnalysis ("data/classifier.pickle")
 26
            SCRAPER = youtube.YouTubeScraper()
 27
 28
            APP = flask.Flask(__name__)
 29
 30
 31
             def save_sentiment(video_sentiment, comments_sentiment):
 32
 33
             \verb"lucu| helper \verb"lucution" "lucution" \verb"lucution" \verb"lucution" \verb"lucution" \verb"lucution" \verb"lucution" \verb"lucution" \verb"lucution" \verb"lucution" "lucution" 
  34
 35
             ____Saves_the_results_of_sentiment_analysis_to_the_database.
  36
             ____The_result_of_each_comment_and_for_the_whole_video_is_saved
 37
             ____:param_video_sentiment: _sentiment _result _for _the _whole _video :
  38
             39
             \verb"uuuu": paramucomments" \_ sentiment: \verb"ucomments" \_ of \verb"uthe" uvideo \verb"uwith" \_ their \verb"usentiments" \\
 40
                       db_sentiments = database.DB_SESSION.query(models.CommentSentiment).filter(
 41
 42
                                 models.CommentSentiment.video_id == video_sentiment.id).all()
 43
                       db_comment_sentiment_ids = [db_comment.id for db_comment in db_sentiments]
 44
```

```
for comment_sentiment in comments_sentiment:
    if comment_sentiment.id not in db_comment_sentiment_ids:
 45
 46
                                 database.DB_SESSION.add(comment_sentiment)
 47
 48
 49
                 db_videosentiment = database.DB_SESSION.query(
 50
                         models. VideoSentiment). filter (
 51
52
53
54
55
56
57
58
                                 models.VideoSentiment.id == video_sentiment.id).first()
                 if db_videosentiment:
                         db_videosentiment = database.DB_SESSION.merge(video_sentiment)
                  else:
                         database.DB_SESSION.add(video_sentiment)
                 database.DB_SESSION.commit()
 59
         @APP. route ("/")
 61
         def index():
 62
 63
         ___Show_the_front_page_to_the_user.
 65
         ___:return: _the _front _page _(index.html)
 67
                 return flask.render_template("index.html")
 68
 69
 70
        @APP. route ("/about")
 71
         def about():
 72
 73
         ____Show_the_about_page_to_the_user.
 74
 75
         uuu: return : uthe uabout upage u( about . html)
 76
 77
                 return flask.render_template("about.html")
 78
 79
 80
         @APP. route ("/video")
         def video():
 81
 82
 83
         ____Video_analysis_page.
 84
         \verb"lucus" Run" the \verb"lucus" classification \verb"lfor" the \verb"linput" the \verb"luser" lhas \verb"lgiven" in the \verb"luser" lassification \verb"lfor" the \verb"linput" the \verb"luser" lassification line to the l
 85
 86
         ____Checks_in_database_whether_the_video_has_been_processed_before._If_it_has
         \verb| uuuubeen uprocessed ubefore und uthere u is uno uchanges, uit us imply ushows uthe ure sult.
 87
 88
         LLLLElse, Lit Lwill Lprocess Lthe Lvideo Land Lshow Lthe Lresult
 89
         ____: return: _The_video_page_(video.html)_with_the_result_from_database_or
 90
         """ classification.
 91
 92
                 video_id = flask.request.args.get("video_id")
 93
                 # if in the form of an url, extract id
if "youtube" in video_id:
 94
                         url = urllib.parse.urlparse(video_id)
query = dict(urllib.parse.parse_qsl(url[4]))
video_id = query["v"]
 95
 96
 97
 98
                 db_video_info = database.DB_SESSION.query(models.Video).filter(
 99
100
                         models.Video.id == video_id).first()
101
                         video_info , categories = SCRAPER.fetch_videoinfo(video_id)
102
103
                 except ValueError:
                         return flask.render_template("error.html"
104
105
                                                                                  error="invalid_video_id")
106
                 except RuntimeError as err:
107
                         return flask.render_template("error.html", error=str(err))
108
109
110
                                 db_video_info.num_of_comments == video_info.num_of_comments):
111
                         LOGGER.info("sentiment_for_video_with_id: _%r_found_in_database",
112
                                                 video_id)
113
114
                         sentiment = database.DB_SESSION.query(models.VideoSentiment).filter(
115
                                 models. VideoSentiment.id == video_id). first()
116
117
                         comments = database.DB_SESSION.query(models.Comment).filter(
                                 models.Comment.video_id == video_id).all()
118
119
120
                        LOGGER.info("processing_new_video_with_id:_%r", video_id)
121
                         if db_video_info:
122
                                 db_video_info = database.DB_SESSION.merge(video_info)
123
124
                                 database.DB_SESSION.add(video_info)
                                 database.DB_SESSION.add_all(categories)
125
126
                         try:
                                 comments = SCRAPER.fetch_comments(video_id)
```

```
except RuntimeError as err:
128
                 return flask.render_template("error.html", error=str(err))
129
130
131
             # get unique comments only
             unique_ids = set([comment.id for comment in comments])
132
133
             comments = [next(com for com in comments if com.id == com_id)
134
                         for com_id in unique_ids]
135
136
             for comment in comments:
                 comment_in_db = database.DB_SESSION.query(models.Comment).filter(
137
138
                     models.Comment.id == comment.id).first()
139
140
                 if not comment_in_db:
                     database .DB_SESSION . add (comment)
141
142
143
             database.DB_SESSION.commit()
144
145
             sentiment, comment_sentiments = ANALYZER.classify_comments(comments)
146
             save_sentiment(sentiment, comment_sentiments)
147
         148
149
150
         return flask.render_template("video.html", video=video_dict)
151
152
153
    @APP. errorhandler (404)
154
    def not_found(error):
155
156
     ____Show_an_error_message_to_the_user.
157
158
    ___:param_error:
159
    ___:return: The error page with the message
160
161
         return flask.render_template("error.html", error=error)
162
163
164
    @APP. route("/previous")
     def previous ():
165
          ""_return _5_latest _sentiment _analyses . _ """
166
         latest = database.DB_SESSION.query(models.Video).order_by(
167
             sqlalchemy.desc(models.Video.timestamp)).limit(5)
168
169
170
         return flask.render_template("previous.html", latest=latest)
171
172
173
    @APP.route("/comment_sentiment_plot.png")
174
     def comment_sentiment_plot():
175
176
     ____Create_comment_sentiment_plot.
177
    178
179
    ___: return : _PNG_ file _showing _the _histogram
180
         video_id = flask.request.args.get("video_id")
181
         fig = Figure(figsize = (5, 5))
182
         axis = fig.add\_subplot(1, 1, 1)
183
184
         fig.patch.set_alpha(0)
185
         query = database.DB_SESSION.query(models.CommentSentiment).filter(
186
         models.CommentSentiment.video_id == video_id).all()
positive = [q.positive for q in query if q.positive]
187
188
189
         negative = [q.positive for q in query if not q.positive]
190
191
             axis.hist(positive, color=["g"], align="left", bins=[0, 1])
192
193
194
             axis.hist(negative, color=["r"], align="right", bins=[0, 1])
195
         axis.set_xlabel("positive ____negative")
196
         axis.set_xticks([])
197
         axis.set_title("comment_sentiment_distribution")
198
         axis.set_ylabel("number_of_comments")
199
         canvas = FigureCanvas(fig)
200
         output = io.BytesIO()
201
         canvas.print_png(output)
202
         response = flask.make_response(output.getvalue())
203
         response.mimetype = 'image/png
204
         return response
205
206
207
     @APP. route("/video_sentiment_plot.png")
208
     def video_sentiment_plot():
209
    ____Create_video_sentiment_plot.
```

```
211
           ____Creating_a_scatter-plot_for_the_sentiments_of_the_video_against_other
212
213
          ___videos_with_the_same_youtube-category
214
          ___:return: _PNG_file _showing _the _scatter -plot
215
216
                    video_id = flask.request.args.get("video_id")
217
                   fig = Figure(figsize = (5, 5))
218
                    axis = fig.add_subplot(1, 1, 1)
219
                    fig.patch.set_alpha(0)
220
221
                    videos = database.DB_SESSION.query(models.VideoSentiment).all()
222
223
                    current_video = database.DB_SESSION.query(models.VideoSentiment).filter(
224
                            models. VideoSentiment.id == video_id). first()
225
226
                    axis.scatter([v.n\_pos for v in videos], [v.n\_neg for v in videos],
227
                                                color="blue", marker="x", label="previously_analysed")
                    axis.scatter(current_video.n_pos, current_video.n_neg, color="black",
228
                                                marker="o", label=video_id)
229
230
                    axis.set_title("video_sentiment_comparison")
231
                    axis.set_xlabel("measure_of_positivity")
                   axis.set_ylabel("measure_of_negativity")
232
233
                    axis.legend()
234
                    canvas = FigureCanvas(fig)
235
                   output = io.BytesIO()
236
                    canvas.print_png(output)
237
                   response = flask.make_response(output.getvalue())
238
                   response.mimetype = 'image/png
239
                    return response
240
241
           if __name__ == "__main__":
                   APP.run(debug=True)
          #!/usr/bin/env python3
   2
          # -*- coding: utf-8 -*-
   3
   4
          # pylint: disable=W0232, R0903
           """_database_models_for_sqlalchemy._"""
   6
          import sqlalchemy
          from database import BASE
   9
  10
           class Comment(BASE):
  12
  13
                   """ _Comment_object . _ """
  14
  15
                    __tablename__ = "comments"
  16
                       _table_args__ = {'extend_existing': True}
                   id = sqlalchemy.Column(sqlalchemy.String, primary_key=True)
video_id = sqlalchemy.Column(sqlalchemy.String,
  17
  18
                                                                                 sqlalchemy.ForeignKey("videos.id"))
  20
                    author_id = sqlalchemy.Column(sqlalchemy.String, nullable=False)
  21
                    author_name = sqlalchemy.Column(sqlalchemy.String, nullable=False)
  22
                    content = sqlalchemy.Column(sqlalchemy.String, nullable=False)
  23
                   published = sqlalchemy.Column(sqlalchemy.DateTime, nullable=False)
  24
  25
                   def __repr__(self):
  26
                                       _repr__method_for_Comment_with_necessary_information._"""
 27
                            return \ "\{\}(id=\{\}, \_video\_id=\{\}, \_author\_id=\{\}, \_content=\{\})". \ format(author\_id=\{\}, \_content=\{\}, \_content=\{\},
                                     self._class_._name_, self.id, self.video_id, self.author_id, self.content)
  28
  30
 31
  32
           class Video (BASE):
 33
                   """_Video_object._"""
  34
 35
                   __tablename__ = "videos"
  36
                   __table_args__ = {'extend_existing': True}
id = sqlalchemy.Column(sqlalchemy.String, primary_key=True, nullable=False)
 37
  38
                   title = sqlalchemy.Column(sqlalchemy.String, nullable=False)
author_id = sqlalchemy.Column(sqlalchemy.String, nullable=False)
viewcount = sqlalchemy.Column(sqlalchemy.Integer, nullable=False)
duration = sqlalchemy.Column(sqlalchemy.Integer, nullable=False)
  39
 40
 41
 42
                   likes = sqlalchemy.Column(sqlalchemy.Integer, nullable=True)
published = sqlalchemy.Column(sqlalchemy.DateTime, nullable=False)
dislikes = sqlalchemy.Column(sqlalchemy.Integer, nullable=True)
 43
 44
 45
                   rating = sqlalchemy.Column(sqlalchemy.Float, nullable=True)
 46
 47
                    num\_of\_raters \ = \ sqlalchemy \, . \, Column(\, sqlalchemy \, . \, Integer \, , \ nullable = True)
                   timestamp = sqlalchemy.Column(sqlalchemy.DateTime, nullable=False)
 48
 49
                   num_of_comments = sqlalchemy.Column(sqlalchemy.Integer,
  50
                                                                                                 nullable=False)
```

```
51
52
           def __repr__(self):
53
54
55
                """ __repr__umethoduforuVideo.u"""
return "{}(id={},utitle={},uauthor_id={})".format(
                     self.__class__._name__, self.id, self.title, self.author_id)
56
57
58
59
      class VideoSentiment(BASE):
           """_VideoSentiment_object._"""
 60
61
          __tablename__ = "videosentiments"
__table_args__ = {'extend_existing': True}
id = sqlalchemy.Column(sqlalchemy.String,
 62
 63
 64
                                       sqlalchemy.ForeignKey("videos.id"),
 65
 66
                                       primary_key=True, nullable=False)
 67
           n_pos = sqlalchemy.Column(sqlalchemy.Float, nullable=False)
 68
           n_neg = sqlalchemy.Column(sqlalchemy.Float, nullable=False)
 69
           result = sqlalchemy.Column(sqlalchemy.String, nullable=False)
 70
 71
           def __repr__(self):
                    __repr__umethod_for_VideoSentiment._"""
 72
 73
                return "\{\}(id=\{\}, n_pos=\{:.3\}, n_neg=\{:.3\}, result=\{\})". format(
                     self.__class__.__name__, self.id, self.n_pos, self.n_neg,
 74
 75
                     self.result)
 76
      class CommentSentiment(BASE):
           """_CommentSentiment_object . _ """
 81
           __tablename__ = "comments entiments"
 82
           __table_args__ = {'extend_existing': True}
id = sqlalchemy.Column(sqlalchemy.String,
 83
 84
                                       sqlalchemy. ForeignKey("comments.id"),
 85
           primary_key=True, nullable=False)
video_id = sqlalchemy.Column(sqlalchemy.String,
 86
 87
                                              sqlalchemy.ForeignKey("videos.id"),
 88
 89
                                               nullable=False)
 90
           positive = sqlalchemy.Column(sqlalchemy.Boolean, nullable=False)
 91
 92
           def __repr__(self):
                """__repr__umethod_for_CommentSentiment..."""
return "{}(id={},_vvideo_id={},_positive={})".format(
    self.__class__.__name__, self.id, self.video_id, self.positive)
 93
 94
 95
96
97
98
      class VideoCategory (BASE):
99
           """_VideoCategory_object._"""
100
101
          __tablename__ = "videocategories"
__table_args__ = {'extend_existing': True}
102
103
           id = sqlalchemy.Column(sqlalchemy.Integer,
104
           105
106
                                               sqlalchemy.ForeignKey("videos.id"),
107
108
                                               nullable=False)
           type = sqlalchemy.Column(sqlalchemy.String, nullable=False)
109
110
111
           def __repr__(self):
                     __repr__umethod_for_VideoCategory.u""
112
                \textbf{return} \ \ \text{``} \{ \} ( id = \{ \}, \_video\_id = \{ \}, \_type = \{ \} ) \text{''}. \ \textbf{format} (
113
114
                     self.__class__.__name__, self.id, self.video_id, self.type)
      #!/usr/bin/env python3
      # -*- coding: utf-8 -*-
      """ _Handling _the _database _connection . _ """
      import sqlalchemy
      from sqlalchemy.ext.declarative import declarative_base
      import os
  6
     CWDIR = os.path.join(os.path.dirname(__file__), "data", "project.db")
ENGINE = sqlalchemy.create_engine("sqlite:///{}".format(CWDIR), echo=False)
 10
      DB_SESSION = sqlalchemy.orm.scoped_session(sqlalchemy.orm.sessionmaker(
 11
 12
           autocommit=False,
 13
           autoflush=False.
           bind=ENGINE))
 14
 15
     BASE = declarative_base()
 16
 17
      def init_db():
```

```
19 """_Create_the_database_and_its_tables.."""
20 import models # noqa # pylint: disable=unused-variable
21 BASE. metadata.create_all(bind=ENGINE)
```

```
#!/usr/bin/env python3
    # -*- coding: utf-8-
 3
    # pylint: disable=R0904
    """ _ Module _ for _ integration _ testing _ the _ webserve _ module . _ """
6
7
    from unittest import TestCase
    import webserve
    import database
10
    import sqlalchemy
    import models
11
12
    import datetime
13
14
    def insert_rows(video_ids=None, positive_list=None):
15
             _Helper_function_for_inserting_test_rows_in_the_database._"""
16
17
         if\ not\ video\_ids:
              video_ids = ["tkXr3uxM2fy"]
18
19
         if not positive_list:
         positive_list = [True]
for video_index , v_id in enumerate(video_ids):
20
21
22
             now = datetime.datetime.now()
database.DB_SESSION.add(models.Video(id=v_id,
23
24
25
26
27
28
29
30
31
                                                         title = "test\_title \_{}".
                                                        format \left( \begin{array}{c} v\_id \end{array} \right),
                                                         author_id="test_author_{{}}"
                                                         .\,format\,(\,v\_id\,)\;,
                                                         viewcount=1,
                                                         duration=10,
                                                         likes=1,
                                                         published=now,
32
33
34
35
                                                         dislikes=1,
                                                         rating = 3,
                                                         num_of_raters = 5,
                                                        num_of_comments=5,
                                                        timestamp=now))
37
              database.DB_SESSION.add(models.VideoSentiment(id=v_id
                                                                   n_{pos} = 5.2
38
39
                                                                   n_neg = 10.2,
40
                                                                   result="negative"))
41
              for com_index, pos in enumerate(positive_list):
42
                   database.DB_SESSION.add(models.Comment(id="comment_{{}}_{{}}"
43
                                                                .format(video_index,
                                                                        com_index),
45
                                                                video_id=v_id,
                                                                author_id="test_author_"
"id_{}"
47
                                                                . format(v_id),
                                                                author_name="test_"
"author_"
49
51
                                                                             "name_{{}}"
                                                                . format(v_id),
53
                                                                content="test_comment"
                                                                         "_text_{{}}"
55
                                                                . format(v_id),
56
57
58
                                                                published=now))
                  database.DB_SESSION.add(
                       models . CommentSentiment (
60
                            id="comment \{ \} \{ \} ". format(video\_index),
61
                                                          com index).
62
                            video_id=v_id , positive=pos))
63
         database .DB_SESSION . commit()
64
65
66
    class WebServeTestCase(TestCase):
67
         """ _ Class_to_test_webserve_module._"""
68
69
         def setUp(self):
70
71
     ____setUp_method_for_all_tests.
72
    ___set_up_method, _running_before
73
    ____each_test ,_sets_up_an_in-memory_sqlite_database
74
    ____for _use _as _ test_database _and
75
    \verb"upuforute sting"
76
              webserve.APP.config["TESTING"] = True
77
78
              self.app = webserve.APP.test_client()
79
              database.ENGINE = sqlalchemy.create_engine("sqlite://", echo=False)
```

```
database.DB_SESSION = \
  80
                                               sqlalchemy.orm.scoped\_session (sqlalchemy.orm
  81
  82
                                                                                                                                    . sessionmaker (
                                                                                                                                               autocommit=False.
  83
  84
                                                                                                                                               autoflush=False.
                                                                                                                                               bind=database .ENGINE))
  85
                                    database.init_db()
  86
  87
                         def tearDown(self):
  88
  89
  90
              ____tearDown_method_for_all_tests.
  91
             uuuuuutear udownumethod, urunning uafter
  92
              ____each_test ,_closes_the_session
  93
  94
                                    database.DB_SESSION.close()
  95
  96
                         def test_start_page_load_correct(self):
  97
  98
              ____Test_that_the_start_page_is_loading_correctly.
  99
100
             ____asserts_on_text_in_index_page
101
102
                                   response = self.app.get("/")
                                    assert "Enter_ID_or_URL" in response.data.decode("utf-8")
103
104
105
                         def test_video_page_load_correct_from_database(self):
106
107
              ____Test_that_video_loads_from_database_directly_if_found.
108
109
             ____asserts_on_text_on_video_analysis_page
110
                                    v_id = "tkXr3uxM2fY"
111
112
                                    insert_rows([v_id])
                                    response = self.app.get("/video?video_id={}".format(v_id))
113
                                    assert "Analysis_of_video_with_ID:_{{}}".format(v_id) in \
114
115
                                                        response. data. decode ("utf-8")
116
117
                         def test_video_page_load_error_wrong_id(self):
118
              ____Test_that_tries_to_input_an_invalid_video_id_at_the_start_page.
119
120
121
              ____asserts_on_error_text_in_video_analysis_page
122
                                   response = self.app.get("/video?video_id={}".format("wrong_id"))
assert "Error:_invalid_video_id" in response.data.decode("utf-8")
123
124
125
126
                         def test_video_page_load_correct_full_youtubeurl(self):
127
128
              ____Test_of_video_page_with_URL.
129
              \verb"lumble" "lumble" "lumble"
130
131
              "https://www.youtube.com/watch?v=tkXr3uxM2fY
132
              \verb"luculus" as serts" \verb"luculus" as serts" \verb"luculus" an alysis" \verb"luculus" page
133
                                    v_id = "tkXr3uxM2fY"
134
135
                                    response = self.app.get(
                                                "/video?video_id=https://www.youtube.com/watch?v={}".format(v_id))
136
                                     assert "Analysis_of_video_with_ID:_{{}}".format(v_id) in
137
138
                                               response.data.decode("utf-8")
139
140
                         def test_video_page_load_correct_from_youtube(self):
141
142
              \verb"limbox{"} Test \verb| limbox{"} that \verb| limbox{"} fetches \verb| lyoutube | limformation | land \verb| lloads | lyideo | land | loads | lyideo | lyid
143
144
             ____this_can_be_considered_the_"normal_use_case"
145
             ____asserts_on_text_in_video_analysis_page
146
147
                                    response = self.app.get("/video?video\_id={}{} ".format(v\_id))
148
149
                                    assert "Analysis_of_video_with_ID:_{}".format(v_id) in \
150
                                                        response.data.decode("utf-8")
151
152
                         def test_video_page_saves_video_in_db(self):
153
154
             Test_asserting_video_is_saved_in_database_after_video_page_load.
155
156
             ____asserts_on_test_database_query
157
                                    v_id = "tkXr3uxM2fY"
159
                                    self.app.get("/video?video_id={}".format(v_id))
                                    vid = database.DB_SESSION.query(models.Video).filter_by(
160
161
                                              id=v_id ). first()
                                     assert vid
```

```
164
                 def test_video_page_updates_sentiment_in_db(self):
165
          ____Test_for_"outdated"_video_in_database.
166
167
168
         \verb"linglist" if \verb"linglist" is \verb"lupdated "lin" the "database"
169
         \verb"unununu" if \verb"uau" video \verb"upreviously \verb"usaved \verb"uinudatabase \verb"uis updated" in \verb"udatabase "uis updated" in "udatabase "uis updated" in "udatabase" in "udatab
170
         ____at_youtube_(contains_new_comments)
171
         uuuuuu asserts uonutest udatabase uquery
172
173
                        v_id = "tkXr3uxM2fY"
174
                        now = datetime.datetime.now()
175
                        negative\_score = 100
176
                         positive_score = 100
177
                         database.DB_SESSION.add(models.VideoSentiment(id=v_id,
178
                                                                                                                 n_neg=negative_score ,
                                                                                                                  n_pos=positive_score
179
                                                                                                                  result="test_positive"))
180
181
182
                         database.DB_SESSION.add(models.Video(id=v_id, title="test_title",
183
                                                                                                author_id="test_author_id"
184
                                                                                                viewcount=1, duration=5, likes=1,
185
                                                                                                published=now,
186
                                                                                                 dislikes=1, rating=5,
187
                                                                                                num\_of\_raters=1,
                                                                                                timestamp=now,
188
189
                                                                                                num_of_comments = 10))
                         database.DB_SESSION.add(models.Comment(id="comment_{{}}".format(v_id),
190
191
                                                                                                    video_id=v_id,
192
                                                                                                    author_id="test_author_id",
193
                                                                                                    author_name="test_author",
                                                                                                    content="test_comment",
194
195
                                                                                                    published=now))
                        database .DB_SESSION . commit()
196
197
198
                         self.app.get("/video?video_id={}".format(v_id))
199
                         sentiment = database.DB_SESSION.query(
200
201
                                models. VideoSentiment). filter_by (id=v_id). first()
202
                        assert sentiment.n_neg != negative_score
assert sentiment.n_pos != positive_score
assert sentiment.result != "test_positive"
203
204
205
206
                 def test_video_page_saves_comment_in_db(self):
207
208
          ____Test_asserting_comments_are_saved_after_video_page_load.
209
210
          ____asserts_on_test_database_query
211
                        v_{id} = "tkXr3uxM2fY"
212
                        self.app.get("/video?video\_id=\{\}".format(v\_id))
213
                        comment = database.DB_SESSION.query(
214
                                models.Comment).filter_by(video_id=v_id).first()
215
216
                         assert comment
217
218
                 def test_video_page_saves_commentsentiment_in_db(self):
219
220
          _____Test_asserting_comment_sentiments_are_saved_after_video_page_load.
221
222
          ____asserts_on_test_database_query
223
224
                        v_id = "tkXr3uxM2fY"
225
                         self.app.get("/video?video_id={}".format(v_id))
                         sentiment = database .DB_SESSION . query (
226
227
                                models.CommentSentiment).filter_by(video_id=v_id).first()
228
                         assert sentiment
229
230
                 def test_video_page_saves_videosentiment_in_db(self):
231
232
         Turbulant asserting Lauvideosentiment Lisusaved Lafter Lvideo Lpage Lload.
233
234
         \verb""" asserts" \verb""" on \verb""" test" \verb""" database \verb""" query
235
         _____
236
                        v_id = "tkXr3uxM2fY"
237
                         self.app.get("/video?video_id={}".format(v_id))
238
                        sentiment = database.DB_SESSION.query(
239
                                models. VideoSentiment). filter_by(id=v_id). first()
240
                         assert sentiment
241
242
                 def test_video_page_comment_sentiment_plot_only_negative(self):
243
244
         Test_asserting_the_comment_sentiment_plot_works_(with_negative).
```

```
246
         ____tests_with_only_negative_comment_sentiments
247
                         v_{id} = "tkXr3uxM2fY"
248
                         insert_rows([v_id], positive_list=[False])
249
250
                         response = self.app.get("/comment_sentiment_plot.png?video_id={}")
251
                                                                        .\,format\,(\,v\_id\,)\,)
252
                         assert response.status_code == 200
253
254
                 def test_video_page_comment_sentiment_plot_only_positive(self):
255
256
          ____Test_asserting_the_comment_sentiment_plot_works_(with_positive).
257
258
         ____tests_with_only_positive_comment_sentiments
259
260
                         v_id = "tkXr3uxM2fY"
261
                         insert_rows([v_id], positive_list=[True])
262
                         response = self.app.get("/comment_sentiment_plot.png?video_id={}")
263
                                                                        .\,format\,(\,v\_id\,)\,)
264
                         assert response.status_code == 200
265
266
                 def test_video_page_comment_sentiment_plot_mixed(self):
267
268
         Test_asserting_the_comment_sentiment_plot_works_(mixed).
269
270
         ____with_mixed_comment_sentiments_(positive_and_negative)
271
         _____
272
                         v_id = "tkXr3uxM2fY"
273
                         insert_rows([v_id], positive_list=[True, False])
274
                         response = self.app.get("/comment_sentiment_plot.png?video_id={}")
275
                                                                        . format(v_id))
276
                         assert response.status_code == 200
277
278
                 def test_video_page_video_sentiment_plot_correct(self):
279
280
          Test that video sentiment on video page load works correctly.
281
282
         ____asserts_on_HTTP_status_=_200
283
284
                         v_id = "tkXr3uxM2fY"
                        285
286
287
288
                         assert response.status_code == 200
289
290
                 def test_previous_page_taking_newest(self):
291
292
          \verb"limbor" Test = that = the = previous = page = shows = the = 5 = most = recent = analyses \; .
293
294
         \verb"luculus inserts" \verb| l10 | test | \verb| result | \verb| and | \verb| asserts | \verb| lon | | 5 | last | \verb| lids
295
                        296
297
298
299
300
301
                         insert_rows(v_ids)
302
                         response = self.app.get("/previous")
for v_id in v_ids[5:]:
303
304
305
                                 assert v_id in response.data.decode("utf-8")
306
307
                 def test_about_page_load_correct(self):
308
309
               .____Test_about_page_loads_correctly.
310
311
         ___asserts_on_text_on_about_page
312
                        response = self.app.get("/about")
assert "Created_by_Sören_Howe_Gersager_and_Anders_Rahbek" in \
313
314
315
                                       response.data.decode("utf-8")
316
317
                 def test_error_page_load_from_wrong_url(self):
318
319
         \verb"current" Test \verb"that \verb"webservice" fails \verb"gracefully \verb"con" wrong \verb"url".
320
321
         und de la company de la compan
322
         ____when_trying_to_load_a_page_that_does_not_exist
323
                        response = self.app.get("/verywrongurl")
assert "Error: _404: _Not_Found" in \
324
325
                                      response.data.decode("utf-8")
326
327
                 def test_video_page_error_disallowed_comments_video(self):
```

```
329
330
                 ____Test_edge-case: _video _with_comments_disallowed.
331
332
                ____Test_that _ensures _an_appropriate _response _is _returned
333
                \verb"aususus" when \verb"atrying \verb"ato \verb"analyze \verb"auvideo \verb"awith \verb"acomments" disabled about the commentation of the commentation
334
                                         response = self.app.get("/video?video_id={}".format("NZQQdlPoz5g"))
assert "Error:_Comments_disallowed_for_video" in \
335
336
337
                                                                  response.data.decode("utf-8")
338
339
                              def test_video_page_error_no_comments_video(self):
340
341
                 ____Test_edge-case: _video_with_no_comments.
342
                \verb"line" Less that \verb"lensures" Landappropriate \verb"less ponsetis" Lireturned
343
344
                uuuuuuwhen utrying uto uanalyze uauvideo uwith uno ucomments
345
346
               ____asserts_on_error_text
347
                                         response = self.app.get("/video?video_id={}".format("wv4ol_Q4G_k"))
assert "Error:_no_comments_for_video" in \
348
349
350
                                                               response.data.decode("utf-8")
               #!/usr/bin/env python3
               \# -*- coding: utf-8 -*-
    2
     3
               # pylint: disable=W0212, R0201
    4
     6
               """ _ tests _ for _ the _ youtube _ module . _ """
     8
               from unittest import mock, TestCase
               import youtube
   10
               import models
   11
               import requests
  12
  13
  14
                class YouTubeTestCase(TestCase):
  15
                              """_This_class_has_test-methods_for_youtube_module._"""
  16
   17
  18
                              @mock.patch("youtube.YouTubeScraper._comment_generator")
                              def test_fetch_comments_correct_id(self, mock_comment):
   19
  20
  21
               ____test_of_fetch_comments_in_YouTubeScraper_with_correct_id.
  22
  23
                calling the the fetch_comments_method_in_the_YouTubeScraper_with
  24
                ____a_correct_id_and_asserting_the_results
               = param_mock_comment: _Mock_object_for_comment_method. _The_method_is_not
               under de la constitución de la c
  26
               _____
  28
                                           scraper = youtube.YouTubeScraper()
                                          # return dummy list
  30
                                         cm = models.Comment(id="test", video_id="test", author_id="test",
                                                                                                           author_name="test", content="test",
  32
                                                                                                           published="test")
  33
                                          mock_comment.return_value = iter([[cm for x in range(100)]])
  34
                                          scraper.fetch_comments("dQw4w9WgXcQ", 50)
                                          scraper._comment_generator.assert_called_with("dQw4w9WgXcQ")
  35
  36
  37
                              @mock.patch("youtube.YouTubeScraper._comment_generator")
  38
                             def test_fetch_comments_returns_correct_over_zero(self, mock_comment):
  39
  40
                 ____test_of_fetch_comments_returning_all_comments_correctly.
  41
  42
                           ____this_method_tests_that_the_correct_amount_of_comments_is_returned
  43
                ___when_specified
                 ____: param_mock: _Mock_object_for__comment_generator
  44
  45
  46
                                          scraper = youtube.YouTubeScraper()
  47
                                          # return dummy list
  48
                                          cm = models.Comment(id="test", video_id="test", author_id="test",
                                                                                                            author_name="test", content="test",
  49
                                                                                                            published="test")
  50
  51
                                          mock_comment.return_value = iter([[cm for x in range(500)]])
  52
                                          comments = scraper.fetch_comments("dQw4w9WgXcQ", 250)
  53
                                           assert len (comments) == 250
  54
  55
                             @mock.\ patch\ ("youtube .\ YouTubeScraper .\ \_comment\_generator")
  56
                             def test_fetch_comments_returns_all_at_zero(self, mock_comment):
  57
  58
                \verb"light" all \verb"lcomments" all \verb"lcomments" unexplicitly .
  59
                \verb"aux up tests" uthat \verb"all ucomments" are \verb"ureturned" uwhen \verb"aunumber" and \verb"ureturned" uwhen \verb"aunumber" and \verb"ureturned" uwhen uwhe
```

```
____is _not_explicitly _specified
     \verb"aux== \verb"comment": \verb"aMock" object" \verb"afor" \verb"acomment" generator \\
62.
63
64
              scraper = youtube.YouTubeScraper()
65
              # return dummy list
              cm = models.Comment(id="test", video_id="test", author_id="test",
 66
67
                                     author_name="test", content="test"
                                     published="test")
 68
 69
              mock\_comment.return\_value = iter([[cm \ for \ x \ in \ range(500)]])
              comments = scraper.fetch_comments("dQw4w9WgXcQ")
 70
71
              assert len (comments) == 500
 72
 73
          @mock.patch("logging.Logger.error")
 74
          {\bf def}\ \ test\_comment\_generator\_wrong\_videoid\_gracefully (self\ ,\ mock\_logger\ ):
 75
     ____test__comment_generator_handles_wrong_video_id.
 76
77
78
     \verb"limbox{"} \verb"limbox{"} \verb"limbox{"} tests \verb"limbox{"} that \verb"limbox{"} \verb"comment_generator \verb"limbox{"} raises \verb"limbox{"} a \verb"limbox{"} Value Error
 79
     ____when_supplied_with_an_invalid_video_id
     ____:param_mock_logger: _Mock_object_for_logger
81
 82
              scraper = youtube.YouTubeScraper()
 83
              generator = scraper._comment_generator("wrong_url")
 84
               self.assertRaises(ValueError, next, generator)
 85
              mock_logger.assert_called()
 87
          @mock.patch("logging.Logger.error")
          def test_fetch_videoinfo_wrong_videoid_gracefully(self, mock_logger):
 89
     ____test_fetch_videoinfo_handles_wrong_video_id.
91
     ____tests_that_fetch_videoinfo_raises_exception
 93
     ____and_error_is_logged_when_supplied_with_an_invalid_video_id
     ____:param_mock_logger: _Mock_object_for_logger
 95
              scraper = youtube.YouTubeScraper()
 96
 97
              self.assertRaises(ValueError, scraper.fetch_videoinfo, "wrong_url")
              mock_logger.assert_called()
99
100
          @mock.patch("logging.Logger.exception")
          @mock. patch ("requests.get")
101
          def test_fetchcomments_no_connection(self, mock_requests, mock_logger):
102
103
104
     ____test_in_case_of_requests_error.
105
     \verb"lucule" tests \verb| lthat| \verb| connection| \verb| error| \verb| l(requests) \verb| lis| \verb| logged|
106
     107
108
109
110
              scraper = youtube.YouTubeScraper()
              mock\_requests.side\_effect = requests.exceptions.RequestException
111
112
              assert mock_logger.assert_called()
              self.assertRaises(requests.exceptions.RequestException, scraper.fetch_comments, "dQw4w9WgXcQ")
113
114
     #!/usr/bin/env python3
     # -*- coding: utf -8 -*-
     # pylint: disable=W0212, R0201
     """ _Tests _for _the _module _sentiment_analysis . _ """
     from unittest import mock, TestCase
     import sentiment_analysis
     import models
     from datetime import datetime
 10
 11
 12
 13
     class SentimentAnalysisTestCase(TestCase):
 14
          """ _This _class _has _test -methods _for _sentiment _analysis _module . _ """
 15
 16
          @mock.\ patch\ ("sentiment\_analysis.SentimentAnalysis.\_train")
 17
          @mock.patch("sentiment_analysis.SentimentAnalysis.load_classifier")
@mock.patch("nltk.data.load")
 18
 19
          \boldsymbol{def} \ \ test\_load\_classifier (self \ , \ train \ , \ load\_classifier \ , \ load\_data) ;
 20
2.1
22
     \verb"lucus" Test \_ the \_ load\_ classifier \_ method.
23
24
     uuuuuuu: paramutrain:
     ____:param_load_classifier:
25
     ____:param_load_data:
     constant return:
27
```

```
29
                                     sentiment_analysis. SentimentAnalysis ("data/classifier.pickle")
  30
                                    load_classifier.assert_called()
 31
                                    load_data.return_value = True
 32
33
                                    train.assert_not_called()
 34
35
                        def test_classify_comments(self):
    """ Test_the_classify_comment_method_in_sentiment_analysis._"""
 36
37
38
                                    comments = []
                                    "I mhappy", "i mhad!"]
 39
 40
 41
                                    for comment in static_comments:
 42
                                               comments . append ( models . Comment ( video_id="dQw4w9WgXcQ" ,
 43
                                                                                                                                        author_id="xxx", author_name="yyy",
 44
                                                                                                                                         content=comment,
 45
                                                                                                                                        published=datetime.now()))
 46
 47
                                    sa = sentiment_analysis.SentimentAnalysis("data/classifier.pickle")
 48
                                    video_sentiment, comments_sentiment = sa.classify_comments(
 49
  50
                                     assert [com.positive for com in comments_sentiment] == [1, 0, 0, 1, 1,
  51
  52
  53
                                    assert video_sentiment.n_pos == 0.5
  54
                                    assert video_sentiment.n_neg == 0.5
  55
                         def test_eval(self):
  57
                                        ""_Test_the_eval_method_in_sentiment_analysis._"""
                                    test_ratios_pos = [0.1, 0.25, 0.35, 0.4, 0.45, 0.5, 0.6, 0.7, 0.85,
  59
                                                                                          0.96]
                                    test_objects = []
  61
                                    for ratio in test_ratios_pos:
                                                test_objects.append(models.VideoSentiment(id="dQw4w9WgXcQ",
 63
                                                                                                                                                                        n pos=ratio.
                                                                                                                                                                        n_neg=(1-ratio),
 64
                                                                                                                                                                        result=""))
  65
 66
 67
                                    sa = sentiment_analysis.SentimentAnalysis("data/classifier.pickle")
                                     result = []
 68
  69
                                    for object test in test objects:
  70
                                                result.append(sa._eval(object_test))
  71
  72
                                    assert [res for res in result] == ["strong_negative",
  73
                                                                                                                                           'slight_negative"
                                                                                                                                        "slight_negative",
  74
 75
76
                                                                                                                                        "neutral",
  77
78
                                                                                                                                        "neutral",
                                                                                                                                       "slight_positive",
"slight_positive",
"strong_positive",
  79
  80
                                                                                                                                        "strong_positive"]
 81
 82
                        @mock.patch("nltk.data.load")
@mock.patch("sentiment_analysis.SentimentAnalysis._train")
@mock.patch("logging.Logger")
 83
 84
 85
 86
                         def test_load_wrong_file(self, nltk_load, train, logger):
 87
 88
             \verb""lest_load_method"
 89
 90
             ____tests_with_wrong_file -name
 91
             ____(or_the_file_doesn't_exist)
 92
 93
             \verb"lumu| paramunltk_load: \verb"lmocklobjectlonunltk". load_method_with_side_effect | load_with_side_effect | load_with_side_effect | load_with_side_effect | load_with_side_effect | load_with_side_effect | load_with_side_effect | load_with_side_effect
 94
             95
             \verb"line" called"
 96
             under the state of the state of
 97
 98
                                    nltk_load.side_effect = (FileExistsError, LookupError)
 99
100
                                    sentiment_analysis. SentimentAnalysis (
101
                                                "data/hello_hello.pickle")
102
103
                                    logger.assert_called()
104
                                     self.assertRaises(FileExistsError, nltk_load)
105
                                    train.assert_called()
             #!/usr/bin/env python3
   2
             # -*- coding: utf-8 -*-
```

3 4 """

This _module_contains_tests_of_code_formats.

```
_-_Flake8
7
    ـــــ Unittest
8
9
    __ Pylint
10
11
    _The_Unittest_is_defined_individually_in_modules_pr._modules_wanted_to_be
12
    _tested
13
    import unittest
14
15
    import os
16
    import subprocess
17
18
    CWD = os.path.dirname(__file__)
19
20
    class TestCodeFormat(unittest.TestCase):
21
22
         """ ____Creating , _listing _and_running_tests . _ """
23
24
         def test_pylint_compliance(self):
    """    Test_the _modules_for_pylint_violations . _ """
25
26
27
              cmd = ["pylint", "-rcfile={}".format(os.path.join(CWD, os.pardir,
28
29
                     "sentimentube", "test"]
30
              try:
31
                  subprocess.check_output(cmd, universal_newlines=True)
32
              except subprocess. CalledProcessError as error:
33
                  errors = [line for line in error.output.split("\n")
34
                              if not line.startswith ("*") and
                              "Locally_disabling" not in line]
36
                  if errors:
                       for error in errors:
                           print(error)
38
                       self.assertTrue(False, msg="pylint_fail")
40
41
         def test_flake8_compliance(self):
42
                 _Test_the_modules_for_flake8_violations._"""
43
              cmd = ["flake8", "sentimentube", "test"]
44
              try:
45
                  subprocess.check_output(cmd, universal_newlines=True)
46
              except subprocess. Called Process Error as err:
                  errors = err.output.split("\n")
47
48
                  if errors:
49
                       for error in errors:
50
                           print (\, \underline{error}\,)
51
                       self.assertTrue(False, msg="flake8_fail")
52
53
         def test_pep257_compliance(self):
             """ Test_the_modules_for_pep257_violations._"""
cmd = ["pep257", "sentimentube", "test"]
54
55
56
57
              subprocess.check_output(cmd, universal_newlines=True)
except subprocess.CalledProcessError as err:
58
                  errors = err.output.split("\n")
59
60
                  if errors:
61
                       for error in errors:
                           print(error)
62
                       self.assertTrue(False, msg="pep257_fail")
63
```

APPENDIX B AUTOMATIC GENERATION OF DOCUMENTATION

Demontration using epydoc:

```
epydoc --pdf -o /home/fnielsen/tmp/epydoc/ --name RBBase wikipedia/api.py
```

Test output (nosetests):

```
nose.config: INFO: Ignoring files matching ['^\\.', '^', '^setup\\.py$']
nose.plugins.cover: INFO: Coverage report will include only packages: ['youtube', 'webserve',
nose.selector: INFO: /home/syre/Dropbox/opgaver/Kandidat/02819 Data mining med Python/datamini
Test the modules for flake8 violations. ... ok
Test the modules for pep257 violations. ... ok
Test the modules for pylint violations. ... ok
Test about page loads correctly. ... ok
Test that webservice fails gracefully on wrong url. ... ok
Test that the previous page shows the 5 most recent analyses. ... ok
Test that the start page is loading correctly. ... ok
Test asserting the comment sentiment plot works (mixed). ... ok
Test asserting the comment sentiment plot works (with negative). ... ok
Test asserting the comment sentiment plot works (with positive). ... ok
Test edge-case: video with comments disallowed. ... ok
Test edge-case: video with no comments. ... ok
Test that video loads from database directly if found. ... ok
Test that fetches youtube information and loads video page. ... ok
Test of video page with URL. ... ok
Test that tries to input an invalid video id at the start page. ... ok
Test asserting comments are saved after video page load. ... ok
Test asserting comment sentiments are saved after video page load. ... ok
Test asserting video is saved in database after video page load. ... ok
Test asserting a videosentiment is saved after video page load. ... ok
Test for "outdated" video in database. ... ok
Test that video sentiment on video page load works correctly. ... ok
Test the classify_comment method in sentiment_analysis. ... ok
Test the eval method in sentiment_analysis. ... ok
Test the load classifier method. ... ok
Test load method. ... ok
test _comment_generator handles wrong video_id. ... ok
test of fetch_comments in YouTubeScraper with correct id. ... ok
test fetch_comments returning all comments unexplicitly. ... ok
test of fetch_comments returning all comments correctly. ... ok
test fetch_videoinfo handles wrong video_id. ... ok
test in case of requests error. ... ok
                   Stmts Miss Cover Missing
_____
                     11 0 100%
database
sentiment_analysis 104
                             0 100%
                             0 100%
webserve
                     116
                     86 0 100%
youtube
______
                    317
                             0 100%
```

Ran 32 tests in 93.541s