Homework_H3.2-Bayes_Learning_for_Text_Classification

October 13, 2020

1 Naive Bayes Text Classification

We made a simple Algorithm to try and classify senteces into either Sports or Not Sports sentences. We start with a couple sentences either classed "Sports" or "Not Sports" and try to classify new sentences based on that. At the end we make a comparison, which class ("Sports" or "Not Sports") the new sentence is more likely to end up in.

1.1 What happens here:

- 1. import everything we need
- 2. Provide training data and do transformations.
- 3. Create dictionaries and count the words in each class.
- 4. Calculate probabilities of the words.

To evaluate a new sentence...

- 5. Vectorize and transform all sentences
- 6. Count all words
- 7. Transform new sentence
- 8. Perform Laplace Smoothing, so we dont multiply with 0
- 9. Calculate probability of the new sentence for each class
- 10. Output whats more likely

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# This notebook was created by Alireza Gholami and Jannik Schwarz

# Importing everything we need
import pandas as pd
from sklearn.feature_extraction.text import CountVectorizer
from nltk.tokenize import word_tokenize

# to check the time of execution, import function time
import time
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[2]: # Naming the columns
columns = ['sentence', 'class']

# Our training data
rows = [['A great game', 'Sports'],
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['The election was over', 'Not Sports'],
    ['Very clean match', 'Sports'],
    ['A clean but forgettable game', 'Sports'],
    ['It was a close election', 'Not Sports'],
    ['A very close game', 'Sports']]

# the data inside a dataframe
training_data = pd.DataFrame(rows, columns=columns)
print(f'The training_data:\n{training_data}\n')
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The training data:

```
sentence
                                      class
0
                                     Sports
                   A great game
1
          The election was over Not Sports
               Very clean match
                                     Sports
3 A clean but forgettable game
                                     Sports
        It was a close election Not Sports
4
5
              A very close game
                                     Sports
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[3]: # Turns the data into vectors
def vectorisation(my_class):

    # my_docs contains the sentences for a class (sports or not sports)
    my_docs = [row['sentence'] for index, row in training_data.iterrows() if___
    ¬row['class'] == my_class]

# creates a vector that counts the occurence of words in a sentence
    my_vector = CountVectorizer(token_pattern=r"(?u)\b\w+\b") # Token-Pattern__
    →damit einstellige Wörter wie 'a' gelesen werden

# transform the sentences
    my_x = my_vector.fit_transform(my_docs)

# tdm = term_document_matrix_sport / create the matrix with the vectors for__
    →a class
    tdm = pd.DataFrame(my_x.toarray(), columns=my_vector.get_feature_names())
    return tdm, my_vector, my_x
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[4]: # Here we are actually creating the matrix for sport and not sport sentences
  tdm_sport, vector_sport, X_sport = vectorisation('Sports')
  tdm_not_sport, vector_not_sport, X_not_sport = vectorisation('Not Sports')

print(f'Sport sentence matrix: \n{tdm_sport}\n')
  print(f'Not sport sentence matrix: \n{tdm_not_sport}\n')
  print(f'Amount of sport sentences: {len(tdm_sport)}')
  print(f'Amount of not sport senteces: {len(tdm_not_sport)}')
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print(f'Total amount of sentences: {len(rows)}')
    Sport sentence matrix:
          but
               clean close forgettable game
                                                great
                                                        match
       1
            0
                          0
                                        0
                                              1
                                                     1
                                                                  0
    1
       0
            0
                   1
                          0
                                        0
                                              0
                                                     0
                                                            1
                                                                  1
            1
                   1
                          0
                                        1
                                                            0
                                                                  0
    3 1
                          1
                                                                  1
    Not sport sentence matrix:
       a close election it over
                                     the
                                          was
                            0
              0
                        1
                                  1
                                        1
                                  0
                                        0
                                             1
    1 1
              1
                        1
                            1
    Amount of sport sentences: 4
    Amount of not sport senteces: 2
    Total amount of sentences: 6
[5]: # creates a dictionary for each class
     def make_list(my_vector, my_x):
         my_word_list = my_vector.get_feature_names()
         my_count_list = my_x.toarray().sum(axis=0)
         my_freq = dict(zip(my_word_list, my_count_list))
         return my_word_list, my_count_list, my_freq
[6]: # create lists
     # word_list_sport = word list ['a', 'but', 'clean', 'forgettable', 'game', _
     → 'great', 'match', 'very']
     # count_list_sport = occurence of words [2 1 2 1 2 1 1 1]
     # freq_sport = combining the two to create a dictionary
     word_list_sport, count_list_sport, freq_sport = make_list(vector_sport, X_sport)
     word_list_not_sport, count_list_not_sport, freq_not_sport =_
     →make_list(vector_not_sport, X_not_sport)
     print(f'sport dictionary: \n{freq_sport}\n')
    print(f'not sport dictionary: \n{freq_not_sport}\n')
    sport dictionary:
    {'a': 3, 'but': 1, 'clean': 2, 'close': 1, 'forgettable': 1, 'game': 3, 'great':
    1, 'match': 1, 'very': 2}
    not sport dictionary:
    {'a': 1, 'close': 1, 'election': 2, 'it': 1, 'over': 1, 'the': 1, 'was': 2}
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[7]: # calculate the probabilty of a word in a sentence of a class
    def calculate_prob(my_word_list, my_count_list):
       my_prob = []
       for my_word, my_count in zip(my_word_list, my_count_list):
           my_prob.append(my_count / len(my_word_list))
       prob_dict = dict(zip(my_word_list, my_prob))
       return prob_dict
[8]: # probabilities of the words in a class
    prob_sport_dict = calculate_prob(word_list_sport, count_list_sport)
    prob_not_sport_dict = calculate_prob(word_list_not_sport, count_list_not_sport)
    print(f'probabilites of words in sport sentences: \n{prob_sport_dict}\n')
    print(f'probabilites of words in not sport sentences: \n{prob_not_sport_dict}')
   probabilites of words in sport sentences:
   0.2222222222222, 'close': 0.11111111111111, 'forgettable':
   probabilites of words in not sport sentences:
   {'a': 0.14285714285714285, 'close': 0.14285714285, 'election':
   0.2857142857142857, 'it': 0.14285714285714285, 'over': 0.14285714285,
   'the': 0.14285714285714285, 'was': 0.2857142857142857}
[9]: # all sentences again
    docs = [row['sentence'] for index, row in training data.iterrows()]
    # vectorizer
    vector = CountVectorizer(token_pattern=r"(?u)\b\w+\b")
    # transform the sentences
    X = vector.fit_transform(docs)
    # counting the words
    total_features = len(vector.get_feature_names())
    total_counts_features_sport = count_list_sport.sum(axis=0)
    total_counts_features_not_sport = count_list_not_sport.sum(axis=0)
    print(f'Amount of distinct words: {total features}')
    print(f'Amount of distinct words in sport sentences:
     →{total counts features sport}')
    print(f'Amount of distinct words in not sport sentences:
     →{total_counts_features_not_sport}')
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Amount of distinct words: 14
Amount of distinct words in sport sentences: 15

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Amount of distinct words in not sport sentences: 9
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[10]: # a new sentence
      new_sentence = 'Hermann plays a TT match'
      # gets tokenized
      new_word_list = word_tokenize(new_sentence)
[11]: # We're using laplace smoothing
      # if a new word occurs the probability would be O
      # So every word counter gets incremented by one
      def laplace(freq, total_count, total_feat):
          prob_sport_or_not = []
          for my_word in new_word_list:
              if my word in freq.keys():
                  counter = freq[my_word]
              else:
                  counter = 0
              # total count is the amount of words in sport sentences and total feat,
       → the total amount of words
              prob_sport_or_not.append((counter + 1) / (total_count + total_feat))
          return prob_sport_or_not
[12]: # probability for the new words
      prob_new_sport = laplace(freq_sport, total_counts_features_sport,__
       →total_features)
      prob_new_not_sport = laplace(freq_not_sport, total_counts_features_not_sport,_u
       →total_features)
      print(f'probability that the word is in a sport sentece: {prob_new_sport}')
      print(f'probability that the word is in a not sport sentece:
       →{prob_new_not_sport}')
     probability that the word is in a sport sentece: [0.034482758620689655,
     0.034482758620689655, 0.13793103448275862, 0.034482758620689655,
     0.06896551724137931]
     probability that the word is in a not sport sentece: [0.043478260869565216,
     0.043478260869565216, 0.08695652173913043, 0.043478260869565216,
     0.043478260869565216]
[13]: # multiplying the probabilities of each word
      new_sport = list(prob_new_sport)
      sport multiply result = 1
      for i in range(0, len(new_sport)):
          sport_multiply_result *= new_sport[i]
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# multiplying the result with the ratio of sports senteces to the total amount_{\sqcup}
       \rightarrow of sentences (here its 4/6)
      sport_multiply_result *= ( len(tdm_sport) / len(rows) )
      # multiplying the probabilities of each word
      new not sport = list(prob new not sport)
      not_sport_multiply_result = 1
      for i in range(0, len(new_not_sport)):
          not_sport_multiply_result *= new_not_sport[i]
      \# multiplying the result with the ratio of sports senteces to the total amount
       \rightarrow of sentences (here its 2/6)
      not_sport_multiply_result *= ( len(tdm_not_sport) / len(rows) )
[14]: # comparing whats more likely
      print(f'The probability of the sentence "{new_sentence}":\nSport vs not⊔
       →sport\n{sport_multiply_result} vs {not_sport_multiply_result}\n\n')
      if not_sport_multiply_result < sport_multiply_result:</pre>
          print('Verdict: It\'s probably a sports sentence!')
      else:
          print('Verdict: It\'s probably not a sport sentence!')
     The probability of the sentence "Hermann plays a TT match":
     Sport vs not sport
     2.6002118815154297e-07 vs 1.0357848652047699e-07
     Verdict: It's probably a sports sentence!
[15]: # print current date and time
      print("date",time.strftime("%d.%m.%Y %H:%M:%S"))
      print ("*** End of Homework H3.2-Bayes Learning for Text Classification ***")
     date 13.10.2020 14:52:26
     *** End of Homework H3.2-Bayes Learning for Text Classification ***
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