

hw3

October 20, 2021

task1

```
[1]: import pandas as pd
import numpy as np
import collections

[2]: data = pd.read_csv('train',sep='\t',names = ['index','word','tag'])

[3]: ttt = data.word.tolist()

[4]: ttt_dict = collections.defaultdict(int)
for i in ttt:
    ttt_dict[i] = ttt_dict[i]+1

[5]: temp_list = []
for w,o in ttt_dict.items():
    temp = [w,int(o)]
    temp_list.append(temp)

[6]: def occrence(e):
    return e[1]
temp_list.sort(reverse=True, key = occrence)

[7]: len(temp_list)

[7]: 43193

[8]: big_list = []
low_frequency = set()

[9]: i = 1
unknown = ['<unk>',0,0]
for w,o in temp_list:
    if o >= 2:
        temp = [w,i,o]
        big_list.append(temp)
        i +=1
    else:
        low_frequency.add(w)
        unknown[2] += o

[10]: big_list.insert(0,unknown)
```

```
[11]: len(big_list)
```

```
[11]: 23183
```

What is the selected threshold for unknown words replacement?

Answer:threshold for unknown words replacement is 4

What is the total size of your vocabulary

Answer:the size of my vocabulary is 13751

unknown number is 42044

```
[12]: with open('vocab.txt','w') as f:
      for i in big_list:
          a = str(i[0]) + '\t' + str(i[1])+'\t'+str(i[2])+'\n'
          f.write(a)
```

```
[13]: data_np = data.to_numpy()
```

```
[14]: #creat a new list
      new_list = []
      for i in data_np:
          if i[1] in low_frequency:
              new_list.append([i[0], '<unk>', i[2]])
          else:
              new_list.append([i[0], i[1], i[2]])
```

```
[15]: # convert the list into sentence
      sentence_list = []

      for i in range(len(new_list)):
          if new_list[i][0] == 1:
              temp = []
              temp.append(new_list[i])
          else:
              temp.append(new_list[i])
          if ((i+1) < len(new_list)) and new_list[i+1][0] == 1:
              sentence_list.append(temp)
```

```
[16]: t_dict = collections.defaultdict(int)
      e_dict = collections.defaultdict(int)
      tag_dict = collections.defaultdict(int)
```

```
[17]: for sentence in sentence_list:
      for i in range(len(sentence)):
          e_dict[sentence[i][2], sentence[i][1]] +=1
```

```

tag_dict[sentence[i][2]] +=1
if sentence[i][0] == 1:
    t_dict[('<s>',sentence[i][2])] += 1
else:
    t_dict[(sentence[i-1][2],sentence[i][2])] += 1

```

```
[18]: emission_dict = {}
```

```
[19]: for key,value in e_dict.items():
      emission_dict[key] = value/tag_dict[key[0]]
```

```
[20]: transitory_dict = {}
```

```
[21]: sentence_num = len(sentence_list)
```

```
[22]: for key,value in t_dict.items():
      if key[0] == '<s>':
          transitory_dict [key] = value/sentence_num
      else:
          transitory_dict [key] = value / tag_dict[key[0]]
```

```
[23]: sentence_num
```

```
[23]: 38217
```

```
[24]: json_transitory_dict = {}
      for key,value in transitory_dict.items():
          json_transitory_dict[str(key)] = value
```

```
[25]: json_emission_dict = {}
      for key,value in emission_dict.items():
          json_emission_dict[str(key)] = value
```

```
[26]: import json
```

```
[27]: final_json = {"transition":json_transitory_dict,"emission":json_emission_dict}
```

```
[28]: out_file = open("hmm.json", "w")
      json.dump(final_json, out_file, indent = 6)

      out_file.close()
```

0.1 hmm greedy

```
[29]: #use sentence_list to appliment hmm greedy
```

```
[30]: word_tag = collections.defaultdict(set)
```

```
[31]: for sentence in sentence_list:
      for i in sentence:
          word_tag[i[1]].add(i[2])
```

```
[32]: word_tag = dict(word_tag)
```

```
[33]: def greedy_hmm(sentence):
    res = []
    for i in range(len(sentence)):
        target_word = sentence[i][1]
        probability_tag = []
        if target_word in word_tag:
            tag_list = list(word_tag[target_word])
        else:
            target_word = '<unk>'
            tag_list = list(word_tag['<unk>'])
        if sentence[i][0] == 1:
            for tag in tag_list:
                if ('<s>',tag) in transitory_dict:
                    t = transitory_dict[('<s>',tag)]
                else: t = 0

                if (tag,target_word) in emission_dict:
                    e = emission_dict[(tag,target_word)]
                else:
                    e = 0
                probability = t*e
                probability_tag.append(probability)

            else:
                for tag in tag_list:
                    if (res[i-1],tag) in transitory_dict:
                        t = transitory_dict[(res[i-1],tag)]
                    else: t = 0

                    if (tag,target_word) in emission_dict:
                        e = emission_dict[(tag,target_word)]
                    else:
                        e = 0
                    probability = t*e
                    probability_tag.append(probability)
                i_tag = tag_list[probability_tag.index(max(probability_tag))]
                res.append(i_tag)
    return res
```

```
[34]: correct = 0
total = 0
for sentence in sentence_list:
    res_tag = greedy_hmm(sentence)
    for i in range(len(res_tag)):
        total += 1
```

```
        if res_tag[i] == sentence[i][2]:
            correct += 1
```

```
[35]: correct/total
```

```
[35]: 0.9490553894497017
```

0.1.1 test greedy hmm

```
[36]: test = pd.read_csv('dev',sep='\t',names = ['index','word','tag'])
```

```
[37]: test_np = test.to_numpy()
```

```
[38]: #creat a test list
new_test = []
for i in test_np:
    if i[1] in low_frequency:
        new_test.append([i[0], '<unk>', i[2]])
    else:
        new_test.append([i[0], i[1], i[2]])
```

```
[39]: # convert the list into sentence
test_sentence_list = []

for i in range(len(new_test)):
    if new_test[i][0] == 1:
        temp = []
        temp.append(new_test[i])
    else:
        temp.append(new_test[i])
    if ((i+1) < len(new_test)) and new_test[i+1][0] == 1:
        test_sentence_list.append(temp)
```

```
[40]: correct = 0
total = 0
for sentence in test_sentence_list:
    res_tag = greedy_hmm(sentence)
    for i in range(len(res_tag)):
        total += 1
        if res_tag[i] == sentence[i][2]:
            correct += 1
```

```
[41]: accuracy_greedy_hmm = correct / total
```

```
[42]: accuracy_greedy_hmm
```

```
[42]: 0.9352035278669611
```

0.1.2 produce greedy.out

```
[43]: out = pd.read_csv('test',sep='\t',names = ['index','word'])
```

```
[44]: out_np = out.to_numpy()
```

```
[45]: #creat a test list
new_out = []
for i in out_np:
    if i[1] in low_frequency:
        new_out.append([i[0], '<unk>'])
    else:
        new_out.append([i[0], i[1]])
```

```
[46]: # convert the list into sentence
out_sentence_list = []

for i in range(len(new_out)):
    if new_out[i][0] == 1:
        temp = []
        temp.append(new_out[i])
    else:
        temp.append(new_out[i])
    if ((i+1) < len(new_out)) and new_out[i+1][0] == 1:
        out_sentence_list.append(temp)
    if i == len(new_out)-1:
        out_sentence_list.append(temp)
```

```
[47]: import copy

w_out_sentence_list = copy.deepcopy(out_sentence_list)

w_out_sentence_list

out_res = []
for sentence in out_sentence_list:
    res_tag = greedy_hmm(sentence)
    out_res.append(res_tag)

out_res

for i in range(len(out_res)):
    for i1 in range(len(out_res[i])):
        w_out_sentence_list[i][i1].append(out_res[i][i1])

[48]: with open('greedy_out.txt','w') as f:
    for sentence in range(len(w_out_sentence_list)):
        if sentence != 0:
```

```

        f.write('\n')
    for (i, w, t) in w_out_sentence_list[sentence]:
        f.write(str(i))
        f.write('\t')
        f.write(str(w))
        f.write('\t')
        f.write(str(t))
        f.write('\n')

```

0.2 viterbi

```

[49]: def viterbi_hmm(sentence):
    res = []
    for i in range(len(sentence)):
        target_word = sentence[i][1]
        probability_tag = {}
        if target_word in word_tag:
            tag_list = list(word_tag[target_word])

        else:
            target_word = '<unk>'
            tag_list = list(word_tag['<unk>'])
        if sentence[i][0] == 1:
            for tag in tag_list:
                if ('<s>',tag) in transitory_dict:
                    t = transitory_dict[('<s>',tag)]
                else: t = 0

                if (tag,target_word) in emission_dict:
                    e = emission_dict[(tag,target_word)]
                else:
                    e = 0
                probability = t*e
                probability_tag[tag] = ('<s>',probability)

        else:
            for tag in tag_list:
                previous_tag_list = []
                for previous_tag in res[i-1]:
                    if (previous_tag,tag) in transitory_dict:
                        t = transitory_dict[(previous_tag,tag)]
                    else: t = 0

                    if (tag,target_word) in emission_dict:
                        e = emission_dict[(tag,target_word)]
                    else:
                        e = 0

```

```

        probility = t*e*res[-1][previous_tag][1]
        previous_tag_list.append((previous_tag,probility))
        previous_tag_list = sorted(previous_tag_list,key = lambda x:
→x[1],reverse = True)
        probility_tag[tag] = previous_tag_list[0]
        res.append(probility_tag)

    return res

```

```
[50]: hhh = viterbi_hmm(sentence_list[77])
```

```
[51]: def backtrace(table):
    tag_backtrace = []
    length = len(table)
    i = length -1
    end_col = table[i]
    end_tag = max(end_col, key=lambda key: end_col[key][1])
    tag_backtrace.append(end_tag)
    if i!=0:
        previous_tag = end_col[end_tag][0]
        i -= 1
    while i >= 0:
        tag_backtrace.append(previous_tag)
        previous_tag_col = table[i][previous_tag]
        i -= 1
        if i>= 0:
            previous_tag = previous_tag_col[0]
    tag_backtrace = list(reversed(tag_backtrace))
    return tag_backtrace

```

```
[52]: table = viterbi_hmm(sentence_list[0])
```

```
[53]: correct = 0
total = 0
for sentence in test_sentence_list:
    table = viterbi_hmm(sentence)
    res_tag = backtrace(table)
    for i in range(len(res_tag)):
        total += 1
        if res_tag[i] == sentence[i][2]:
            correct += 1

```

```
[54]: hmm_viterbi_accuracy = correct/total
```

```
[55]: viterbi_hmm(sentence_list[77][0:2])
```



```
[55]: [{'VB': ('<s>', 1.2010925470418137e-07),
      'DT': ('<s>', 0.018196945407718525),
      'NNP': ('<s>', 7.906632093753297e-05)},
      {'RB': ('DT', 4.3783663451007866e-08),
      'IN': ('DT', 1.4395871855441722e-07),
      'JJ': ('DT', 3.323118608213109e-05)}]
```

hmm_viterbi_accuracy

```
[56]: hmm_viterbi_accuracy
```

```
[56]: 0.9480231649095643
```

```
[57]: w_out_sentence_list = copy.deepcopy(out_sentence_list)
```

w_out_sentence_list

```
out_res = []
for sentence in out_sentence_list:
    table = viterbi_hmm(sentence)
    res_tag = backtrace(table)
    out_res.append(res_tag)

for i in range(len(out_res)):
    for i1 in range(len(out_res[i])):
        w_out_sentence_list[i][i1].append(out_res[i][i1])
```

```
[58]: with open('viterbi_out.txt', 'w') as f:
      for sentence in range(len(w_out_sentence_list)):
          if sentence != 0:
              f.write('\n')
          for (i, w, t) in w_out_sentence_list[sentence]:
              f.write(str(i))
              f.write('\t')
              f.write(str(w))
              f.write('\t')
              f.write(str(t))
              f.write('\n')
```

```
[59]: print('The accuracy for greedy hmm is '+str(accuracy_greedy_hmm)+'\n The_
      ↳accuracy for viterbi is '+str(hmm_viterbi_accuracy))
```

The accuracy for greedy hmm is 0.9352035278669611

The accuracy for viterbi is 0.9480231649095643

```
[ ]:
```