▼ Lab#4, NLP@CGU Spring 2023

This is due on 2023/04/20 16:00, commit to your github as a PDF (lab4.pdf) (File>Print>Save as PDF).

IMPORTANT: After copying this notebook to your Google Drive, please paste a link to it below. To get a publicly-accessible link, hit the *Share* button at the top right, then click "Get shareable link" and copy over the result. If you fail to do this, you will receive no credit for this lab!

LINK: paste your link here

https://colab.research.google.com/drive/1eUlmdaTfOVK0krdGgBr8o-X_0Xzt9_Sf?usp=sharing

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Name:吳佳恩

Word Embeddings for text classification

請訓練一個 kNN或是SVM 分類器來和 Google's Universal Sentence Encoder (a fixed-length 512-dimension embedding) 的分類結果比較

```
! wget -0 - D card. \ db - \underline{https://github.com/c.jwu/c.jwu.github.io/raw/master/courses/nlp2023/lab4-D card-D ataset. \ db - \underline{https://github.com/c.jwu.github.io/raw/master/courses/nlp2023/lab4-D card-D ataset. \ db - \underline{https://github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.com/c.jwu.github.co
              Resolving github.com (github.com)... 140.82.121.3
              Connecting to github.com (github.com) |140.82.121.3|:443... connected.
              HTTP request sent, awaiting response... 302 Found
              Location: https://raw.githubusercontent.com/cjwu/cjwu.github.io/master/courses/nlp2023/lab4-Dcard-Dataset.db [following]
               --2023-04-24 12:31:24-- https://raw.githubusercontent.com/cjwu/cjwu.github.jo/master/courses/nlp2023/lab4-Dcard-Dataset.db
              Resolving raw.githubusercontent.com (raw.githubusercontent.com)... 185.199.109.133, 185.199.111.133, 185.199.110.133, ...
              Connecting to raw.githubusercontent.com (raw.githubusercontent.com) | 185.199.109.133 | :443... connected.
              HTTP request sent, awaiting response... 200 OK
              Length: 151552 (148K) [application/octet-stream]
              Saving to: 'Deard. db
                                                                  100%[===========] 148.00K --.-KB/s
              2023-04-24 12:31:24 (13.2 MB/s) - 'Dcard.db' saved [151552/151552]
import sqlite3
import pandas as pd
conn = sqlite3.connect("Dcard.db")
df = pd.read_sq1("SELECT * FROM Posts;", conn)
df
```

```
title
                createdAt
                                                     excerpt categories
                                                                                 topics forum en forum zh
                  2022-03- 專題需要數據 🥺
                                         希望各位能花個20秒幫我
      0
                                                                                          dressup
                                                                                                      穿搭
           04T07:54:19.886Z
                                🥨 幫填 ~
                                         想找這套衣服 😳 , 但發現
                 2022-03-
                                           不知道該用什麼關鍵字
                                                                          衣服 | 鞋子 | 衣物 |
                         #詢問 找衣服 🔢
                                                                   詢問
                                                                                          dressup
                                                                                                      穿搭
!pip3 install -q tensorflow_text
!pip3 install -q faiss-cpu
                                                                           - 6.0/6.0 MB 46.8 MB/s eta 0:00:00
                                                                          - 17.6/17.6 MB 43.1 MB/s eta 0:00:00
                                                       舎コ
import tensorflow_hub as hub
import numpy as np
import tensorflow_text
embed model = hub.load("https://tfhub.dev/google/universal-sentence-encoder-multilingual/3")
                                          的注阻配皮 上曾 相
texts \bullet = \bullet "[" \bullet + \bullet df['title'] \bullet + \bullet'] \bullet [' \bullet + \bullet df['topics'] \bullet + \bullet'] \bullet ' \bullet + \bullet df['excerpt'] \bullet
texts[docid]
     '[開了新頻道] [Youtuber | 頻道 | 有趣 | 日常 | 搞笑] 昨天上了第一支影片・之前有發過沒有線條的動畫影片・新的頻道改成有線
     條的·感覺大家好像比較喜歡這種風格·試試看新的風格·影片內容主要是分享自己遇到的小故事·不知道這樣的頻道大家是否會想要看
    呢? 壹歡的話也
embeddings = embed model(texts)
embed_arrays = np.array(embeddings)
index arrays = df.index.values
topk = 10
# Step 1: Change data type
embeddings = embed_arrays.astype("float32")
\sharp Step 2: Instantiate the index using a type of distance, which is L2 here
index = faiss.IndexFlatL2(embeddings.shape[1])
# Step 3: Pass the index to IndexIDMap
index = faiss.IndexIDMap(index)
# Step 4: Add vectors and their IDs
index. add with ids (embeddings, index arrays)
D, I = index.search(np.array([embeddings[docid]]), topk)
plabel = df.iloc[docid]['forum_zh']
cols to show = ['title', 'excerpt', 'forum zh']
plist = df.loc[I.flatten(), cols_to_show]
precision = 0
for index, row in plist.iterrows():
   if plabel == row["forum_zh"]:
    precision += 1
print("precision = ", precision/topk)
precision = 0
df.loc[I.flatten(), cols_to_show]
    precision = 0.8
                          title
                                                                                          excerpt forum_zh
                                 昨天上了第一支影片,之前有發過沒有線條的動畫影片,新的頻道改成有線條的,感覺
     355
                       開了新頻道
                                                                                                  YouTuber
                                                                                 大家好像比較喜歡...
                                  哈哈哈哈,沒錯我就是親友團來介紹一個我覺得很北七的頻道,現在觀看真的低的可
             一個隨性系YouTube頻道
     359
                                                                                                  YouTuber
                                                                                憐,也沒事啦,就多...
            《庫洛魔法使》(迷你)服
                                 又來跟大家分享新的作品了~ · 頻道常常分享 {縫紉} {服裝製作} 等相關教學 · 大家對服
     330
                                                                                                  YouTuber
                          裝製作
           自己沒搞清楚狀況就不要亂
                                 勾惡幫主在自己頻道簡介跟每部影片的下方都已經說明了,要分會會長以上才能看全部
     342
                                                                                                  YouTuber
                                                                                 影片, 這個說明已...
                          黑幻惡
                                    友人傳了這篇文給我,我一看,十大廚師系YouTuber,就猜一定有MASA,果不其
                   廚師系YouTuber
                                                                                                  YouTuber
     338
                                                                                      然・榜上有...
                                 小時候都很喜歡看真珠美人魚和守護甜心,但是!!,每次晚餐看電視的時候,只要有
                   毁我童年的家人
                                                                                                      有趣
     243
                                                                                   播映到這種場景....
          喜歡看寵物頻道的有嗎? 🙋
     349
                                                                                                  YouTuber
```

▼ Implemement Your kNN or SVM classifier Here!

請比較分類結果中選出 topk 相近的筆數,並計算 forum_zh 是否都有在 query text 的 forum_zh 中

[開了新頻道] [Youtuber | 頻道 | 有趣 | 日常 | 搞笑]

```
precision = 0
topk = 10
# YOUR CODE HERE!
# IMPLEMENTIG TRIE IN PYTHON
import tensorflow_hub as hub
import numpy as np
import tensorflow_text
import faiss
from sklearn.cluster import KMeans
# 载入 Universal Sentence Encoder
embed_model = hub.load("https://tfhub.dev/google/universal-sentence-encoder-multilingual/3")
# 将文本转换为向量
texts = "[" + df['title'] + '] [' + df['topics'] + '] ' + df['excerpt']
embeddings = embed model(texts)
embed_arrays = np.array(embeddings)
# 运行 k-means
kmeans = KMeans(n clusters-num clusters, random state=42).fit(embed arrays)
# 获取每个文本所属的类别
labels = kmeans, labels
# 创建一个字典,将每个类别对应的文本索引存储在其中
clusters = \{\}
for i, label in enumerate(labels):
      if label not in clusters:
             clusters[label] = []
      clusters[label].append(i)
# 对每个查询进行处理
docid = 355
query = texts[docid]
# 获取与查询相似的文本
query_embedding = embed_model([query])[0]
query_embedding_array = np.array([query_embedding])
# 在 Faiss 中进行相似度搜索
index = faiss.IndexFlatIP(embeddings.shape[1])
index.add(embed_arrays)
D, I = index.search(query_embedding_array, k=10)
# 计算查询的类别
query label = kmeans.predict(query embedding array)[0]
# 获取相似的文本并计算准确率
precision = 0
for i in range(10):
      index = I[0][i]
      label = kmeans.labels_[index]
      if label == query label:
             precision += 1
# # DO NOT MODIFY THE BELOW LINE!
print("precision = "
                   ", precision/topk)
/usr/local/lib/python3.9/dist-packages/sklearn/cluster/_kmeans.py:870: FutureWarning: The default value of `n_init` will change from 10 to 'auto
      warnings.warn(
    precision = 0.9
```

```
docid = 355
texts = "["
            + df['title'] + '] [' + df['topics'] + '] '
texts[docid]
     '[開了新頻道] [Youtuber | 頻道 | 有趣 | 日常 | 搞笑] '
!pip install pytrie
     Looking in indexes: <a href="https://pypi.org/simple">https://us-python.pkg.dev/colab-wheels/public/simple/</a>
     Collecting pytrie
      Downloading PyTrie-0.4.0. tar.gz (95 kB)
                                                                                - 95.1/95.1 kB 7.1 MB/s eta 0:00:00
      Preparing metadata (setup.py) ... done
     Requirement already satisfied: sortedcontainers in /usr/local/lib/python3.9/dist-packages (from pytrie) (2.4.0)
     Building wheels for collected packages: pytrie
      Building wheel for pytrie (setup.py) ... done
       Created wheel for pytrie: filename=PyTrie-0.4.0-py3-none-any.whl size=6104 sha256=522225411198cd7c533ea098c4b50e6c5749c9349df22bdba8fb2591bc0d
      Successfully built pytrie
     Installing collected packages: pytrie
     Successfully installed pytrie-0.4.0
!pip install pygtrie
     Looking in indexes: https://pypi.org/simple, https://us-python.pkg.dev/colab-wheels/public/simple/
     Collecting pygtrie
       Downloading pygtrie-2.5.0-py3-none-any.whl (25 kB)
     Installing collected packages: pygtrie
     Successfully installed pygtrie-2.5.0
import numpy as np
import pandas as pd
import sqlite3
import tensorflow hub as hub
import pygtrie as trie
from sklearn.neighbors import KNeighborsClassifier
# 读取数据
conn = sqlite3.connect("Dcard.db")
df = pd.read_sql("SELECT * FROM Posts;", conn)
texts = "[" + df['title'] + '] [' + df['topics'] + '] ' + df['excerpt']
# 加载预训练模型
embed_model = hub.load("https://tfhub.dev/google/universal-sentence-encoder-multilingual/3")
# 使用Trie数据结构存储文本数据
trie_dict = trie.StringTrie(separator=' ')
for i, text in texts.iteritems():
       trie_dict[text] = i
# 定义查询文本和docid
docid = 355
query_text = texts[docid]
# 在Trie中寻找与查询文本相似的前10个文本的索引
similar_indices = [index for _, index in trie_dict.items(prefix=query_text, max_matches=10)]
# 提取相似文本的标签(即forum zh)
similar_labels = df.iloc[similar_indices]['forum_zh'].values
# 对训练集进行编码,训练KNN分类器
train_embeddings = embed_model(texts)
train_labels = df['forum_zh'].values
n_{neighbors} = 10
knn = KNeighborsClassifier(n_neighbors=n_neighbors)
knn.fit(train_embeddings, train_labels)
# 对查询文本进行编码,进行预测
test_embeddings = embed_model([query_text])
pred labels = knn.predict(test embeddings)
# 计算精度
precision = 0
for i, label in enumerate(similar_labels):
       if label == pred_labels:
              precision += 1
print(f"precision = {precision/n_neighbors}")
```

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9 4秒 完成時間:晚上11:19

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