# kwe-comparison

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# 1 Keyword Extraction Comparison

This notebook contains a comparison of various Keyword Extraction (KWE) strategies applied to the scotch dataset. Each strategy is timed and its extracted keywords are retained.

A pdf of this notebook is saved - I have too frequently accidentally lost results of time intensive cells!

```
[1]: import pandas as pd
     import numpy as np
     from nltk.tokenize import word_tokenize
     from nltk.stem import WordNetLemmatizer
     from whiskynlp.Vectorizer import ListFeatureVectorizer
     from whiskynlp.GraphKeywordExtraction import GraphKE
     from whiskynlp. WhiskyLemmatizer import WhiskyLemmatizer
     from nltk import pos_tag
     import math
     import time
     from operator import itemgetter
[2]: t1 = time.time()
    t2 = time.time()
[4]: t2 - t1
[4]: 0.01999974250793457
[5]: df = pd.read_csv("scotch-no-dupes.csv")
     # Making corpus list to operate on
     df["All"] = df["Nose"] + " " + df["Palate"] + " " + df["Finish"]
     lst = GraphKE().makeCorpusList(df, "All")
     corp = GraphKE().makeCorpus(lst)
     whisky_stopwords = WhiskyLemmatizer().swords
[6]: results = {}
```

## 1.1 TF-IDF

https://www.analyticsvidhya.com/blog/2020/11/words-that-matter-a-simple-guide-to-keyword-extraction-in-python/

```
[7]: # Based on implementation from analyticsvidhya, adapted
     def wordTFScore(corpus, docs):
         tf = \{\}
         words = corpus.split()
         n_words = len(words)
         for word in words:
             word.replace('.','')
             if word not in whisky_stopwords:
                 if word in tf:
                     tf[word] += 1
                 else:
                     tf[word] = 1
         tf.update(
             (x, y/int(n_words)) for x, y in tf.items()
         )
         return tf
     def countDocs(word, docs):
         final = [all([w in x for w in word]) for x in docs]
         return int(len([docs[i] for i in range(0, len(final)) if final[i]]))
     def wordIDFScore(corpus, docs):
         idf = \{\}
         words = corpus.split()
         n_words = len(words)
         n docs = len(docs)
         for word in words:
             word = word.replace('.','')
             if word not in whisky_stopwords:
                 if word in idf:
                     idf[word] = countDocs(word, docs)
                 else:
                     idf[word] = 1
         idf.update(
             (x, math.log(int(n_docs)/y)) for x, y in idf.items()
         return idf
     def tf_idf(corpus, docs):
         tf = wordTFScore(corpus, docs)
         idf = wordIDFScore(corpus, docs)
         tf_idf = [
             (word, tf[word]*idf[word]) for word in tf.keys()
```

```
]
tf_idf.sort(key=itemgetter(1), reverse=True)
return tf_idf
```

## 1.1.1 No Lemmatizing

```
[8]: t1 = time.time()

tf_idf_wrds = tf_idf(corp, lst)

t2 = time.time()

tf_idf_time = t2 - t1

print(f"Time taken: {tf_idf_time} seconds")

results["tf_idf"] = {}

results["tf_idf"]["kws"] = tf_idf_wrds

results["tf_idf"]["time"] = tf_idf_time
```

Time taken: 1148.445481300354 seconds

#### 1.1.2 WordNetLemmatizer

```
[9]: wordnet = WordNetLemmatizer()
     # Wordnet doesn't have an implementation of a cache, meaning it needs to queryu
     \rightarrow wordnet
     # each time. Adding in a cache to save time.
     wordnet_cache = {}
     def replaceWithLemmas(txt):
         split = txt.split()
         lemma_txt = ''
         for word in split:
             if word not in whisky_stopwords:
                 if word in wordnet_cache:
                     lemma = wordnet_cache[word]
                 else:
                     # Getting POS tag
                     tag = pos_tag([word])[0][1][0].lower()
                     if tag == "v":
                         tag = "v"
                     if tag == "j":
                         tag = "a"
                     else:
                         tag = "n"
                     lemma = wordnet.lemmatize(word, tag)
                 lemma_txt = lemma_txt + ' ' + lemma
         return txt
```

```
[10]: t1 = time.time()
  wordnet_lst = [replaceWithLemmas(txt) for txt in lst]
  wordnet_corp = GraphKE().makeCorpus(wordnet_lst)
  t2 = time.time()
  wordnet_lematizing = t2-t1
  results["wordnet_lemmatizing_time"] = wordnet_lematizing
  print(f"Time taken: {wordnet_lematizing} seconds")
```

Time taken: 125.97502851486206 seconds

```
[11]: t1 = time.time()

wordnet_tf_idf = tf_idf(wordnet_corp, wordnet_lst)

t2 = time.time()
 wordnet_tf_idf_time = t2 - t1
 print(f"Time taken: {wordnet_tf_idf_time} seconds")

results["wordnet_tf_idf"] = {}
 results["wordnet_tf_idf"]["kws"] = wordnet_tf_idf
 results["wordnet_tf_idf"]["time"] = wordnet_tf_idf_time
```

Time taken: 1204.9405109882355 seconds

### 1.1.3 Custom Whisky Lemmatizer

```
[12]: t1 = time.time()
   whiskylemmatizer = WhiskyLemmatizer()
   whisky_lst = [
          " ".join(whiskylemmatizer.tokenFilter(text)) for text in lst
]
   whisky_corp = GraphKE().makeCorpus(whisky_lst)
   t2 = time.time()
   whisky_lemmatizing_time = t2 - t1
   results["whisky_lemmatizing_time"] = whisky_lemmatizing_time
   print(f"Time taken : {whisky_lemmatizing_time} seconds")
```

Time taken: 4.4477245807647705 seconds

```
[13]: t1 = time.time()
    whisky_tf_idf = tf_idf(whisky_corp, whisky_lst)

t2 = time.time()
    whisky_tf_idf_time = t2 - t1
    print(f"Time taken: {whisky_tf_idf_time} seconds")

results["whisky_tf_idf"] = {}
```

```
results["whisky_tf_idf"]["kws"] = whisky_tf_idf
results["whisky_tf_idf"]["time"] = whisky_tf_idf_time
```

Time taken: 1166.1536271572113 seconds

#### 1.2 RAKE

```
[52]: from rake_nltk import Rake, Metric
  def rakeAsList(corpus):
    raker = Rake(corpus, min_length=1, max_length=1)
    raker.extract_keywords_from_text(corpus)
    return raker.get_ranked_phrases_with_scores()
```

#### 1.2.1 Unlemmatized

```
[15]: t1 = time.time()

unlemma_rake = rakeAsList(corp)

t2 = time.time()
unlemma_rake_time = t2 - t1
print(f"Time taken: {unlemma_rake_time} seconds")

results["unlemma_rake"] = {}
results["unlemma_rake"]["kws"] = unlemma_rake
results["unlemma_rake"]["time"] = unlemma_rake_time
```

Time taken: 0.44502973556518555 seconds

### 1.2.2 Wordnet Lemmatized

```
[16]: t1 = time.time()

wordnet_rake = rakeAsList(wordnet_corp)

t2 = time.time()
wordnet_rake_time = t2 - t1
print(f"Time taken: {wordnet_rake_time} seconds")

results["wordnet_rake"] = {}
results["wordnet_rake"]["kws"] = wordnet_rake
results["wordnet_rake"]["time"] = wordnet_rake_time
```

Time taken: 0.46202850341796875 seconds

# 1.2.3 Whisky Lemmatized

```
[17]: t1 = time.time()

whisky_rake = rakeAsList(whisky_corp)

t2 = time.time()
whisky_rake_time = t2 - t1
print(f"Time taken: {whisky_rake_time} seconds")

results["whisky_rake"] = {}
results["whisky_rake"]["kws"] = whisky_rake
results["whisky_rake"]["time"] = whisky_rake_time
```

Time taken: 0.2689990997314453 seconds

# 1.3 Eigencentrality RAKE

```
[18]: t1 = time.time()
    erake = GraphKE().keywordExtract(df, "All")

t2 = time.time()
    erake_time = t2 - t1
    print(f"Time taken: {erake_time} seconds")

results["erake"] = {}
    results["erake"]["kws"] = erake
    results["erake"]["time"] = erake_time
```

Building Corpus
Building Graph
Candidate Keywords Selected
Edges Created
Ranking Nodes
Time taken: 44.06533336639404 seconds

# 1.4 Saving Results to JSON

```
[19]: import json
with open("results.json", "w") as f:
    json.dump(results, f)
```