

Add-one smoothing

In the 18th century, Laplace invented add-one smoothing. In add-one smoothing, 1 is added to the count of each word. Instead of 1, any other value can also be added to the count of unknown words so that unknown words can be handled and their probability is non-zero. Pseudo count is the value (that is, either 1 or nonzero) that is added to the counts of unknown words to make their probability nonzero.

```
In [5]: import nltk
corpus=u"<s> hello how are you doing ? Hope you find the book interesting. </s>".split()
```

```
In [6]: sentence=u"<s>how are you doing</s>".split()
```

```
In [3]: vocabulary = set(corpus)
len(vocabulary)
```

```
Out[3]: 13
```

```
In [7]: cfd = nltk.ConditionalFreqDist(nltk.bigrams(corpus))
```

```
In [13]: cfd.keys()
```

```
Out[13]: dict_keys(['<s>', 'hello', 'how', 'are', 'you', 'doing', '?', 'Hope', 'find', 'the', 'book', 'interesting.', '<s>how'])
```

```
In [9]: [cfd[a][b] for (a,b) in nltk.bigrams(sentence)] # The corpus counts of each bigram
```

```
Out[9]: [0, 1, 0]
```

```
In [10]: [cfd[a].N() for (a,b) in nltk.bigrams(sentence)] # The counts for each word in the sentence
```

```
Out[10]: [0, 1, 2]
```

```
In [11]: [cfd[a].freq(b) for (a,b) in nltk.bigrams(sentence)] # There is already a FreqDist
```

```
Out[11]: [0, 1.0, 0.0]
```

```
In [14]: [1 + cfd[a][b] for (a,b) in nltk.bigrams(sentence)] # Laplace smoothing of each bigram
```

```
Out[14]: [1, 2, 1]
```

```
In [15]: [len(vocabulary) + cfd[a].N() for (a,b) in nltk.bigrams(sentence)] # We need to add the pseudo count
```

```
Out[15]: [13, 14, 15]
```

```
In [16]: # The smoothed Laplace probability for each bigram:
[1.0 * (1+cfid[a][b]) / (len(vocabulary)+cfid[a].N()) for (a,b) in nltk.bigrams(sent
```

```
Out[16]: [0.07692307692307693, 0.14285714285714285, 0.06666666666666667]
```

Consider another way of performing Add-one smoothing or generating a Laplace probability distribution:

```
In [18]: # MLEProbDist is the unsmoothed probability distribution
cpd_mle = nltk.ConditionalProbDist(cfd, nltk.MLEProbDist,bins=len(vocabulary))
```

```
In [19]: [cpd_mle[a].prob(b) for (a,b) in nltk.bigrams(sentence)] # Now we can get the MLE
```

```
Out[19]: [0, 1.0, 0.0]
```

```
In [22]: #LaplaceProbDist is the add-one smoothed ProbDist
cpd_laplace = nltk.ConditionalProbDist(cfd, nltk.LaplaceProbDist,bins=len(vocabula
```

```
In [23]: # Getting the Laplace probabilities is the same as for MLE
[cpd_laplace[a].prob(b) for (a,b) in nltk.bigrams(sentence)]
```

```
Out[23]: [0.07692307692307693, 0.14285714285714285, 0.06666666666666667]
```

```
In [25]:
```

```
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NameError                                Traceback (most recent call last)
<ipython-input-25-94ea72af3875> in <module>()
----> 1 corpus_kn = [((x[0],y[0],z[0]),(x[1],y[1],z[1])) for x, y, z in nltk.
trigrams(sent)] for sent in corpus_kn[:100]]

NameError: name 'corpus_kn' is not defined
```

```
In [ ]:
```