

```
In [1]: import pandas as pd

sms_spam = pd.read_csv('spam - spam.csv')

print(sms_spam.shape)
sms_spam.head()
```

(5572, 2)

```
Out[1]:
```

| | Category | Message |
|---|----------|---|
| 0 | ham | Go until jurong point, crazy.. Available only ... |
| 1 | ham | Ok lar... Joking wif u oni... |
| 2 | spam | Free entry in 2 a wkly comp to win FA Cup fina... |
| 3 | ham | U dun say so early hor... U c already then say... |
| 4 | ham | Nah I don't think he goes to usf, he lives aro... |

```
In [3]: sms_spam['Category'].value_counts(normalize=True)
```

```
Out[3]: Category
ham      0.865937
spam     0.134063
Name: proportion, dtype: float64
```

```
In [5]: # Randomize the dataset
data_randomized = sms_spam.sample(frac=1, random_state=1)

# Calculate index for split
training_test_index = round(len(data_randomized) * 0.8)

# Split into training and test sets
training_set = data_randomized[:training_test_index].reset_index(drop=True)
test_set = data_randomized[training_test_index:].reset_index(drop=True)

print(training_set.shape)
print(test_set.shape)
```

(4458, 2)

(1114, 2)

```
In [7]: training_set['Category'].value_counts(normalize=True)
test_set['Category'].value_counts(normalize=True)
```

```
Out[7]: Category
ham      0.868043
spam     0.131957
Name: proportion, dtype: float64
```

```
In [9]: training_set.head(3)
```

```
Out[9]:
```

| | Category | Message |
|---|----------|---|
| 0 | ham | Yep, by the pretty sculpture |
| 1 | ham | Yes, princess. Are you going to make me moan? |
| 2 | ham | Welp apparently he retired |

```
In [15]: training_set['Message'] = training_set['Message'].str.replace(r'^\w\s', ' ', regex=True)
training_set['Message'] = training_set['Message'].str.lower() # Converts text to lowercase
training_set.head(3)
```

```
Out[15]:
```

| | Category | Message |
|---|----------|--|
| 0 | ham | yep by the pretty sculpture |
| 1 | ham | yes princess are you going to make me moan |
| 2 | ham | welp apparently he retired |

```
In [22]: training_set['Message'] = training_set['Message'].str.split()

vocabulary = []
for sms in training_set['Message']:
    for word in sms:
        vocabulary.append(word)

vocabulary = list(set(vocabulary))
```

```
In [24]: len(vocabulary)
```

```
Out[24]: 7778
```

```
In [26]: word_counts_per_sms = {'secret': [2,1,1],
                                'prize': [2,0,1],
                                'claim': [1,0,1],
                                'now': [1,0,1],
                                'coming': [0,1,0],
                                'to': [0,1,0],
                                'my': [0,1,0],
                                'party': [0,1,0],
                                'winner': [0,0,1]
                                }

word_counts = pd.DataFrame(word_counts_per_sms)
word_counts.head()
```

Out[26]:

| | secret | prize | claim | now | coming | to | my | party | winner |
|---|--------|-------|-------|-----|--------|----|----|-------|--------|
| 0 | 2 | 2 | 1 | 1 | 0 | 0 | 0 | 0 | 0 |
| 1 | 1 | 0 | 0 | 0 | 1 | 1 | 1 | 1 | 0 |
| 2 | 1 | 1 | 1 | 1 | 0 | 0 | 0 | 0 | 1 |

```
In [30]: word_counts_per_sms = {unique_word: [0] * len(training_set['Message']) for unique_w
for index, sms in enumerate(training_set['Message']):
    for word in sms:
        word_counts_per_sms[word][index] += 1
```

```
In [32]: word_counts = pd.DataFrame(word_counts_per_sms)
word_counts.head()
```

Out[32]:

| | wiv | 50perwksub | thin | into | dom | 08717111821 | pours | something | letter | tb | ... | ba |
|---|-----|------------|------|------|-----|-------------|-------|-----------|--------|----|-----|----|
| 0 | 0 | | 0 | 0 | 0 | | 0 | 0 | 0 | 0 | ... | |
| 1 | 0 | | 0 | 0 | 0 | | 0 | 0 | 0 | 0 | ... | |
| 2 | 0 | | 0 | 0 | 0 | | 0 | 0 | 0 | 0 | ... | |
| 3 | 0 | | 0 | 0 | 0 | | 0 | 0 | 0 | 0 | ... | |
| 4 | 0 | | 0 | 0 | 0 | | 0 | 0 | 0 | 0 | ... | |

5 rows × 7778 columns



```
In [34]: training_set_clean = pd.concat([training_set, word_counts], axis=1)
training_set_clean.head()
```

Out[34]:

| | Category | Message | wiv | 50perwksub | thin | into | dom | 08717111821 | pours | someth |
|---|----------|--|-----|------------|------|------|-----|-------------|-------|--------|
| 0 | ham | [yep, by, the, pretty, sculpture] | 0 | 0 | 0 | 0 | 0 | 0 | 0 | |
| 1 | ham | [yes, princess, are, you, going, to, make, me,...] | 0 | 0 | 0 | 0 | 0 | 0 | 0 | |
| 2 | ham | [welp, apparently, he, retired] | 0 | 0 | 0 | 0 | 0 | 0 | 0 | |
| 3 | ham | [havent] | 0 | 0 | 0 | 0 | 0 | 0 | 0 | |
| 4 | ham | [i, forgot, 2, ask, ü, all, smth, there, s, a,...] | 0 | 0 | 0 | 0 | 0 | 0 | 0 | |

5 rows × 7780 columns

In [38]:

```

# Isolating spam and ham messages first
spam_messages = training_set_clean[training_set_clean['Category'] == 'spam']
ham_messages = training_set_clean[training_set_clean['Category'] == 'ham']

# P(Spam) and P(Ham)
p_spam = len(spam_messages) / len(training_set_clean)
p_ham = len(ham_messages) / len(training_set_clean)

# N_Spam
n_words_per_spam_message = spam_messages['Message'].apply(len)
n_spam = n_words_per_spam_message.sum()

# N_Ham
n_words_per_ham_message = ham_messages['Message'].apply(len)
n_ham = n_words_per_ham_message.sum()

# N_Vocabulary
n_vocabulary = len(vocabulary)

# Laplace smoothing
alpha = 1

```

In [40]:

```

# Initiate parameters
parameters_spam = {unique_word:0 for unique_word in vocabulary}
parameters_ham = {unique_word:0 for unique_word in vocabulary}

# Calculate parameters

```

```

for word in vocabulary:
    n_word_given_spam = spam_messages[word].sum() # spam_messages already defined
    p_word_given_spam = (n_word_given_spam + alpha) / (n_spam + alpha*n_vocabulary)
    parameters_spam[word] = p_word_given_spam

    n_word_given_ham = ham_messages[word].sum() # ham_messages already defined
    p_word_given_ham = (n_word_given_ham + alpha) / (n_ham + alpha*n_vocabulary)
    parameters_ham[word] = p_word_given_ham

```

In [44]: `import re`

```

def classify(message):
    """
    message: a string
    """

    # Use raw string for regular expression
    message = re.sub(r'\W', ' ', message) # Removes punctuation
    message = message.lower().split()

    p_spam_given_message = p_spam
    p_ham_given_message = p_ham

    for word in message:
        if word in parameters_spam:
            p_spam_given_message *= parameters_spam[word]

        if word in parameters_ham:
            p_ham_given_message *= parameters_ham[word]

    print('P(Spam|message):', p_spam_given_message)
    print('P(Ham|message):', p_ham_given_message)

    if p_ham_given_message > p_spam_given_message:
        print('Label: Ham')
    elif p_ham_given_message < p_spam_given_message:
        print('Label: Spam')
    else:
        print('Equal probabilities, have a human classify this!')

```

In [46]: `classify('WINNER!! This is the secret code to unlock the money: C3421.')`

```

P(Spam|message): 1.2923061134414878e-25
P(Ham|message): 1.938145870890239e-27
Label: Spam

```

In [48]: `classify("Sounds good, Tom, then see u there")`

```

P(Spam|message): 2.423500921528076e-25
P(Ham|message): 3.689516028273414e-21
Label: Ham

```

In [62]: `import re`

```

def classify_test_set(message):
    """

```

```

message: a string
'''

# Use raw string for regular expression
message = re.sub(r'\W', ' ', message) # Removes punctuation
message = message.lower().split()

p_spam_given_message = p_spam
p_ham_given_message = p_ham

for word in message:
    if word in parameters_spam:
        p_spam_given_message *= parameters_spam[word]

    if word in parameters_ham:
        p_ham_given_message *= parameters_ham[word]

if p_ham_given_message > p_spam_given_message:
    return 'ham'
elif p_spam_given_message > p_ham_given_message:
    return 'spam'
else:
    return 'needs human classification'
import re

def classify_test_set(message):
    '''
    message: a string
    '''

    # Use raw string for regular expression
    message = re.sub(r'\W', ' ', message) # Removes punctuation
    message = message.lower().split()

    p_spam_given_message = p_spam
    p_ham_given_message = p_ham

    for word in message:
        if word in parameters_spam:
            p_spam_given_message *= parameters_spam[word]

        if word in parameters_ham:
            p_ham_given_message *= parameters_ham[word]

    if p_ham_given_message > p_spam_given_message:
        return 'ham'
    elif p_spam_given_message > p_ham_given_message:
        return 'spam'
    else:
        return 'needs human classification'

```

```

In [64]: test_set['predicted'] = test_set['Message'].apply(classify_test_set)
test_set.head()

```

Out[64]:

| | Category | Message | predicted |
|---|----------|---|-----------|
| 0 | ham | Later i guess. I needa do mcat study too. | ham |
| 1 | ham | But i haf enuff space got like 4 mb... | ham |
| 2 | spam | Had your mobile 10 mths? Update to latest Oran... | spam |
| 3 | ham | All sounds good. Fingers . Makes it difficult ... | ham |
| 4 | ham | All done, all handed in. Don't know if mega sh... | ham |

In [66]:

```

correct = 0
total = test_set.shape[0]

for row in test_set.iterrows():
    row = row[1]
    if row['Category'] == row['predicted']:
        correct += 1

print('Correct:', correct)
print('Incorrect:', total - correct)
print('Accuracy:', correct/total)

```

Correct: 1098
Incorrect: 16
Accuracy: 0.9856373429084381

In []: