# Language Modeling Assignment Report Noah Sterling, Lukas Reisch

# **Preprocessing**

We decided to code our project using Python 2.7.12. There were a couple of things we decided to do right away. For one we decided that the we did not want to include the From, Subject or any email addresses in the training model so we removed any references to them as best we could. We also decided we wanted to removed any weird email signature as best as we could since these usually consisted of symbols rather than actual words. The main rationale for removing these things was because we did not want them to appear in our random generated sentences. Removing most of the punctuation and the email markers from the training model just made out random sentences look much cleaner. We also decided that capitalization did not matter. We made everything lower case in order to make the calculation easier.

#### **Random Sentence Generator**

Before we could actually generate any sentences from the training model, we had to first code the unigram and bigram models. In order to do this we decided to loop through all of the text files in the data set and use a preexisting program to parse the text file into individual tokens. The program we used is called spaCy (<a href="https://spacy.io/docs/#install-source-osx">https://spacy.io/docs/#install-source-osx</a>). Once we had all of the tokens from the training set, we created two dictionaries, one for the unigram model and one for the bigram model. These dictionaries contained either the unigram or bigram and its associated number of token occurrences in the training set. When iterating through the tokens, we kept track of the total number of tokens as well as the number of occurrences for each unigram or bigram element.

After all of the occurrences were counted we used the n-gram equations from class in order to calculate the unigram and bigram probabilities, which is the probability that that word or word pair appears in a sentence based on the given training data.

Once the probabilities were calculated, we used them in order to generate our

sentences. We created a program which picks a word based on its probability for the unigram model and picks the successive word given a starting word for the bigram model based on the probability that that particular bigram shows up.

#### **Random Sentences**

# **Atheism Unigram**

- <s> set why not states is as cruel invited messiah the say so or </s>
- <s> net upon of us me argument conquered this things it banking </s>
- <s> religious kelley and believe to here ideals bronx to </s>

#### **Atheism Bigram**

- <s> think i will also i've seen the help </s>
- <s> then one can you get an islamic law </s>
- <s> mean that there have in such inconsequential characteristics </s>

### **Auto Unigram**

- <s> all dealer fairly out mail keep </s>
- <s> crime forget not doesn't on it heard </s>
- <s> at ban is explorer mechanic </s>

#### **Auto Bigram**

- <s> thanks to clear coated </s>
- <s> if you're not reproduce the beach and stay with a patent on him a c + very ugly station wagon has passed over the problem with gaia </s>
- <s> 357 magnum revolver sitting in the inside </s>

#### **Graphics Unigram**

- <s> with paste for harddisk ! a low-level client it's </s>
- <s> is several 24 anti-aliasing unless of the there image post on unix z morph users functions </s>
- <s> trigger available client by problem to well which status this vesa d able publish and sale anything anyone </s>

#### **Graphics Bigram**

- <s> you are interested send a 24 bit has a dizzying number of the nearest archive location graphics graphics </s>
- <s> were saying help in jpeg it eventually degrade to see it until i spend days </s>
- <s> this to poke me on </s>

#### **Medicine Unigram**

- <s> a vitamin all handedness that then the side thorough the administration </s>
- <s> re-entry if none reports it wants crew-cut set-up </s>
- <s> discovered available dollars inhibitors </s>

# **Medicine Bigram**

<s> i simply move the other licensed physician enough for cesarean rate in investigations of these are usually have stabilized over 100 % of a

philosopher must a different so her gynocologist even look into what i can't she hasn't shown to come to eat pasta rice </s>

<s> upon the galvanocautery describes general procedure it doesn't know of some recreational </s>

<s> both wash hands he was the 19th century that supposedly enormous benefits </s>

#### **Motorcycles Unigram**

- <s> meeting in & #007 was the francisco </s>
- <s> circuitous worst back time ama toronto bikes in sitting just </s>
- <s> the turbo no is </s>

#### **Motorcycles Bigram**

- <s> both bikes with stupid act </s>
- <s> the gas tank is sponsored by one rational to do </s>
- <s> speedy mercer writes no way out of thinking about them out of questions but it was a cop doesn't like handcuffs </s>

#### **Religion Unigram**

- <s> pride to denying centuries mention everything love is blessed the use </s>
- <s> rob long other not is bottles peoples interesting </s>
- <s> there was speaking comments more the hurt they you there jesus a murray styles john peace </s>

# **Religion Bigram**

- <s> i found them </s>
- <s> right and that calls it is the entire physical presence of the text you want to show more than a bit </s>
- <s> i tell you an uncompromising standard axiom that has it </s>

#### **Space Unigram**

- <s> upcoming the an atmosphere on 200mph was measures giant budget walking various the 602 a since questions </s>
- <s> some 995 \_ a mysteries 2016 despite release </s>
- <s> thing you suprised catch other </s>

#### Space Bigram

- <s> usually induced partly because say nasa fact that i really depressed </s>
- <s> upon the way of studies in article </s>
- <s> the class work and fictional contains formulae for apollo but it's not \_the gods must model which philosopher would only a valid abort maneuvers to go </s>

# **Analysis**

Overall the generated sentences were pretty good. Obviously the bigram sentences are much better than the unigram sentences because the Language Model is more constricted. In the unigram model, the next word will just be something from the corpus, but in the bigram model, the next word

has to be a valid bigram from the corpus in order for that pair to have a non-zero probability. For this reason, things like "19th Century", "24 bit", and "357 magnum revolver" all make sense and work small scale within the sentence. Even still however, the sentences remain largely ungrammatical and very rarely turn out meaningful. This is to be partially expected though because it is only a bigram model, it is unsmoothed, and the training set was a collection of emails, which, aside from tweets or texts, are one of the worst things to use if you want to create a grammatical meaningful sentence generator. One thing that the generator does well is it preserves the topic of the corpus. It is relatively easy to guess the topic of the training set based on the sentences the program outputs.