Universal stuff In [7]: import string import nltk import gensim import numpy as np from pathlib import Path stopwords = nltk.corpus.stopwords.words("english") lemmatizer = nltk.stem.WordNetLemmatizer() def penntag\_to\_wordnettag(tag): if tag.startswith("NN"): return nltk.corpus.wordnet.NOUN elif tag.startswith("VB"): return nltk.corpus.wordnet.VERB elif tag.startswith("JJ"): return nltk.corpus.wordnet.ADJ elif tag.startswith("RB"): return nltk.corpus.wordnet.ADV else: return nltk.corpus.wordnet.NOUN common terms = ["America", "American", "Americans", "Applause.", "Applause", "applause.", "applause.", "back", "Congress", "could", "country", "good", "government", "know", "like", "make", "must", "nation", "people", "President", "president", "United", "States", "They", "they", "this", "want", "would", "year", "great", "national", "need", "many", "well", "take", "this", "trump", "think", "happen", "vote", "world", "time", "come", "life", "look", "never", "This", "upon", "purpose", "s hall", "goal", "first", "every", "work", "help", "today", "meet", "tonight", "federal", "last", "righ t", "tell", "thing", "that", "much", "south", "South", "also", "believe", "north", "North", "east", "East", "program", "state", "policy", "increase", "thank", "give", "percent", "booing", "decisi on", "problem", "well", "begin", "APPLAUSE", "TRUMP", "HILLARY", "CLINTON", "office", "Well", "Hillary" , "Clinton", "Trump", "audience", "bring", "BOOING", "Thank", "That", "that", "Ever", "ever", "AUDIE NCE", "Even", "even", "continue", "folk", "Folk", "leave", "Leave", "talk", "Talk", "Lose", "lose", "Really", "really", "Million", "million", "Care", "care", "Place", "place", "mean", "Mean", "Lov e", "love", "Start", "start", "city"] Dwight D. Eisenhower In [2]: eisenhower\_path = Path("presidential\_speeches/eisenhower") eisenhower files = [ ] for file in eisenhower\_path.iterdir(): if file.name != ".DS\_Store": eisenhower\_files.append(file) with open("output file", "w") as outfile: for fname in eisenhower\_files: with open(fname) as infile: outfile.write(infile.read()) with open("output\_file") as f: eisenhower uncleaned = f.read() eisenhower\_tagged = nltk.pos\_tag(nltk.word\_tokenize(eisenhower\_uncleaned)) eisenhower lemmatized = [ ] for word, tag in eisenhower tagged: wntag = penntag to wordnettag(tag) eisenhower lemmatized.append(lemmatizer.lemmatize(word, wntag)) eisenhower text = [ ] for word in eisenhower lemmatized: if word not in stopwords and word not in common\_terms and len(word) >= 4 and word.strip(string.punc tuation) != "": eisenhower text.append(word.lower()) eisenhower\_corpus = [ ] eisenhower\_corpus.append(eisenhower\_text) eisenhower\_dictionary = gensim.corpora.Dictionary(eisenhower\_corpus) eisenhower\_gensim = [ ] for document in eisenhower\_corpus: eisenhower\_gensim.append(eisenhower\_dictionary.doc2bow(document)) eisenhower\_model = gensim.models.ldamodel.LdaModel(eisenhower\_gensim, num topics = 5, id2word = eisenhower dictionary, passes = 20, iterations = 500, alpha = "asymmetric",  $random_state = 0)$ for topic in eisenhower\_model.print\_topics(num\_words = 10): print(topic) (0, '0.000\*"peace" + 0.000\*"free" + 0.000\*"soviet" + 0.000\*"area" + 0.000\*"faith" + 0.000\*"future" + 0.000\*"power" + 0.000\*"security" + 0.000\*"atomic" + 0.000\*"hope"') (1, '0.011\*"peace" + 0.009\*"free" + 0.006\*"soviet" + 0.005\*"hope" + 0.005\*"future" + 0.005\*"party" + 0.005\*"atomic" + 0.005\*"power" + 0.004\*"security" + 0.004\*"freedom"') (2, '0.000\*"free" + 0.000\*"peace" + 0.000\*"soviet" + 0.000\*"power" + 0.000\*"atomic" + 0.000\*"faith" + 0.000\*"party" + 0.000\*"principle" + 0.000\*"hope" + 0.000\*"security"') (3, '0.000\*"peace" + 0.000\*"free" + 0.000\*"soviet" + 0.000\*"nations" + 0.000\*"atomic" + 0.000\*"securi ty" + 0.000\*"power" + 0.000\*"future" + 0.000\*"military" + 0.000\*"party"') (4, '0.000\*"peace" + 0.000\*"free" + 0.000\*"soviet" + 0.000\*"hope" + 0.000\*"power" + 0.000\*"future" + 0.000\*"future + 00.000\*"party" + 0.000\*"strength" + 0.000\*"nations" + 0.000\*"principle"') Richard Nixon In [8]: | dtype = np.float64 nixon\_path = Path("presidential\_speeches/nixon") nixon files = [ ] for file in nixon\_path.iterdir(): if file.name != ".DS Store": nixon\_files.append(file) with open("output\_file", "w") as outfile: for fname in nixon files: with open(fname) as infile: outfile.write(infile.read()) with open("output\_file") as f: nixon uncleaned = f.read() nixon tagged = nltk.pos tag(nltk.word tokenize(nixon uncleaned)) nixon lemmatized = [ ] for word, tag in nixon\_tagged: wntag = penntag to wordnettag(tag) nixon lemmatized.append(lemmatizer.lemmatize(word, wntag)) nixon text = [ ] for word in nixon lemmatized: if word not in stopwords and word not in common terms and len(word) >= 4 and word.strip(string.punc tuation) != "": nixon\_text.append(word.lower()) nixon corpus = [ ] nixon corpus.append(nixon text) nixon dictionary = gensim.corpora.Dictionary(nixon corpus) nixon gensim = [ ] for document in nixon corpus: nixon gensim.append(nixon dictionary.doc2bow(document)) nixon model = gensim.models.ldamodel.LdaModel(nixon gensim, num topics = 5, id2word = nixon\_dictionary, passes = 20, iterations = 500, alpha = "asymmetric", random state = 0)for topic in nixon model.print topics(num words = 10): print(topic) (0, '0.000\*"vietnam" + 0.000\*"peace" + 0.000\*"force" + 0.000\*"action" + 0.000\*"watergate" + 0.000\*"hi story" + 0.000\*"power" + 0.000\*"hope" + 0.000\*"concern" + 0.000\*"negotiation"') (1, '0.000\*"vietnam" + 0.000\*"peace" + 0.000\*"force" + 0.000\*"vietnamese" + 0.000\*"watergate" + 0.000 \*"full" + 0.000\*"action" + 0.000\*"together" + 0.000\*"house" + 0.000\*"strong"') (2, '0.000\*"peace" + 0.000\*"vietnam" + 0.000\*"home" + 0.000\*"force" + 0.000\*"action" + 0.000\*"become" + 0.000\*"effort" + 0.000\*"responsibility" + 0.000\*"history" + 0.000\*"power"') (3, '0.000\*"peace" + 0.000\*"vietnam" + 0.000\*"action" + 0.000\*"house" + 0.000\*"future" + 0.000\*"powe r" + 0.000\*"question" + 0.000\*"support" + 0.000\*"force" + 0.000\*"responsibility"') (4, '0.014\*"peace" + 0.010\*"vietnam" + 0.004\*"force" + 0.004\*"action" + 0.003\*"responsibility" + 0.00 3\*"vietnamese" + 0.003\*"future" + 0.003\*"watergate" + 0.003\*"negotiation" + 0.003\*"house"') Gerald Ford In [4]: | ford path = Path("presidential speeches/ford") ford files = [ ] for file in ford\_path.iterdir(): if file.name != ".DS Store": ford files.append(file) with open ("output file", "w") as outfile: for fname in ford files: with open(fname) as infile: outfile.write(infile.read()) with open("output file") as f: ford uncleaned = f.read() ford tagged = nltk.pos tag(nltk.word tokenize(ford uncleaned)) ford lemmatized = [ ] for word, tag in ford\_tagged: wntag = penntag to wordnettag(tag) ford lemmatized.append(lemmatizer.lemmatize(word, wntag)) ford text = [ ] for word in ford lemmatized: if word not in stopwords and word not in common terms and len(word) >= 4 and word.strip(string.punc tuation) != "": ford\_text.append(word.lower()) ford corpus = [ ] ford corpus.append(ford text) ford dictionary = gensim.corpora.Dictionary(ford corpus) ford gensim = [ ] for document in ford\_corpus: ford\_gensim.append(ford\_dictionary.doc2bow(document)) ford model = gensim.models.ldamodel.LdaModel(ford gensim, num topics = 5, id2word = ford dictionary, passes = 20, iterations = 500, alpha = "asymmetric",  $random_state = 0)$ for topic in ford\_model.print\_topics(num\_words = 10): print(topic) (0, '0.000\*"energy" + 0.000\*"peace" + 0.000\*"economic" + 0.000\*"economy" + 0.000\*"food" + 0.000\*"foreign" + 0.000\*"union" + 0.000\*"future" + 0.000\*"home" + 0.000\*"inflation"') (1, '0.000\*"energy" + 0.000\*"peace" + 0.000\*"future" + 0.000\*"foreign" + 0.000\*"economic" + 0.000\*"europe" + 0.000\*"food" + 0.000\*"action" + 0.000\*"inflation" + 0.000\*"price"') (2, '0.000\*"energy" + 0.000\*"europe" + 0.000\*"foreign" + 0.000\*"achieve" + 0.000\*"economic" + 0.000 \*"food" + 0.000\*"future" + 0.000\*"price" + 0.000\*"action" + 0.000\*"peace"') (3, '0.000\*"energy" + 0.000\*"peace" + 0.000\*"future" + 0.000\*"economic" + 0.000\*"power" + 0.000\*"unio n" + 0.000\*"foreign" + 0.000\*"food" + 0.000\*"economy" + 0.000\*"security"')(4, '0.008\*"energy" + 0.005\*"peace" + 0.005\*"future" + 0.004\*"economic" + 0.004\*"foreign" + 0.003\*"fo od" + 0.003\*"security" + 0.003\*"economy" + 0.003\*"price" + 0.003\*"union"') Ronald Reagan In [5]: reagan\_path = Path("presidential\_speeches/reagan") reagan\_files = [ ] for file in reagan\_path.iterdir(): if file.name != ".DS\_Store": reagan files.append(file) with open("output file", "w") as outfile: for fname in reagan\_files: with open(fname) as infile: outfile.write(infile.read()) with open("output\_file") as f: reagan uncleaned = f.read() reagan tagged = nltk.pos tag(nltk.word tokenize(reagan uncleaned)) reagan lemmatized = [ ] for word, tag in reagan\_tagged: wntag = penntag to wordnettag(tag) reagan\_lemmatized.append(lemmatizer.lemmatize(word, wntag)) reagan\_text = [ ] for word in reagan\_lemmatized: if word not in stopwords and word not in common\_terms and len(word) >= 4 and word.strip(string.punc tuation) != "": reagan\_text.append(word.lower()) reagan\_corpus = [ ] reagan corpus.append(reagan text) reagan dictionary = gensim.corpora.Dictionary(reagan corpus) reagan\_gensim = [ ] for document in reagan corpus: reagan\_gensim.append(reagan\_dictionary.doc2bow(document)) reagan\_model = gensim.models.ldamodel.LdaModel(reagan\_gensim, num topics = 5, id2word = reagan dictionary, passes = 20, iterations = 500, alpha = "asymmetric", random state = 0)for topic in reagan model.print topics(num words = 10): print(topic) (0, '0.000\*"peace" + 0.000\*"soviet" + 0.000\*"freedom" + 0.000\*"force" + 0.000\*"union" + 0.000\*"econom ic" + 0.000\*"together" + 0.000\*"family" + 0.000\*"future" + 0.000\*"hope"') (1, '0.000\*"freedom" + 0.000\*"peace" + 0.000\*"soviet" + 0.000\*"force" + 0.000\*"economic" + 0.000\*"fre e" + 0.000\*"human" + 0.000\*"there" + 0.000\*"hope" + 0.000\*"family"') (2, '0.007\*"peace" + 0.006\*"freedom" + 0.005\*"soviet" + 0.004\*"force" + 0.004\*"economic" + 0.003\*"freedom" + 0.005\*"soviet" + 0.004\*"force" + 0.004\*"economic" + 0.003\*"freedom + 0.005\*"soviet" + 0.005\*"soviet\* +e" + 0.003\*"hope" + 0.003\*"family" + 0.003\*"union" + 0.003\*"future"') (3, '0.000\*"peace" + 0.000\*"freedom" + 0.000\*"soviet" + 0.000\*"force" + 0.000\*"free" + 0.000\*"economi c" + 0.000\*"hope" + 0.000\*"future" + 0.000\*"defense" + 0.000\*"child"') (4, '0.000\*"peace" + 0.000\*"freedom" + 0.000\*"economic" + 0.000\*"force" + 0.000\*"soviet" + 0.000\*"sup port" + 0.000\*"child" + 0.000\*"family" + 0.000\*"together" + 0.000\*"there"') George H. W. Bush In [6]: bush\_path = Path("presidential\_speeches/bush") bush files = [ ] for file in bush\_path.iterdir(): if file.name != ".DS\_Store": bush files.append(file) bush files with open ("output file", "w") as outfile: for fname in bush files: with open(fname) as infile: outfile.write(infile.read()) with open("output file") as f: bush uncleaned = f.read() bush tagged = nltk.pos tag(nltk.word tokenize(bush uncleaned)) bush lemmatized = [ ] for word, tag in bush tagged: wntag = penntag to wordnettag(tag) bush lemmatized.append(lemmatizer.lemmatize(word, wntag)) bush\_text = [ ] for word in bush lemmatized: if word not in stopwords and word not in common terms and len(word) >= 4 and word.strip(string.punc tuation) != "": bush text.append(word.lower()) bush corpus = [ ] bush corpus.append(bush text) bush dictionary = gensim.corpora.Dictionary(bush corpus) bush gensim = [ ] for document in bush corpus: bush gensim.append(bush dictionary.doc2bow(document)) bush\_gensim bush model = gensim.models.ldamodel.LdaModel(bush gensim, num topics = 5, id2word = bush dictionary, passes = 20, iterations = 500, alpha = "asymmetric", random state = 0)for topic in bush model.print topics(num words = 10): print(topic) (0, '0.007\*"force" + 0.004\*"iraq" + 0.004\*"peace" + 0.004\*"soviet" + 0.004\*"child" + 0.004\*"future" + 0.004\*"security" + 0.004\*"freedom" + 0.004\*"change" + 0.003\*"union"') (1, '0.000\*"force" + 0.000\*"security" + 0.000\*"peace" + 0.000\*"future" + 0.000\*"soviet" + 0.000\*"mili tary" + 0.000\*"freedom" + 0.000\*"home" + 0.000\*"iraq" + 0.000\*"support"') (2, '0.000\*"force" + 0.000\*"iraq" + 0.000\*"free" + 0.000\*"child" + 0.000\*"soviet" + 0.000\*"future" + 0.000\*"peace" + 0.000\*"union" + 0.000\*"freedom" + 0.000\*"security"') (3, '0.000\*"force" + 0.000\*"change" + 0.000\*"iraq" + 0.000\*"stand" + 0.000\*"soviet" + 0.000\*"peace" + 0.000\*"there" + 0.000\*"together" + 0.000\*"freedom" + 0.000\*"economic"') (4, '0.000\*"force" + 0.000\*"future" + 0.000\*"iraq" + 0.000\*"peace" + 0.000\*"change" + 0.000\*"friend" + 0.000\*"freedom" + 0.000\*"child" + 0.000\*"free" + 0.000\*"family"') George W. Bush In [7]: | gwbush path = Path("presidential speeches/gwbush") gwbush files = [ ] for file in gwbush path.iterdir(): if file.name != ".DS Store": gwbush files.append(file) gwbush files with open ("output file", "w") as outfile: for fname in gwbush files: with open(fname) as infile: outfile.write(infile.read()) with open("output file") as f: gwbush uncleaned = f.read() gwbush tagged = nltk.pos tag(nltk.word tokenize(gwbush uncleaned)) gwbush lemmatized = [ ] for word, tag in gwbush tagged: wntag = penntag to wordnettag(tag) gwbush lemmatized.append(lemmatizer.lemmatize(word, wntag)) gwbush text = [ ] for word in gwbush lemmatized: if word not in stopwords and word not in common\_terms and len(word) >= 4 and word.strip(string.punc tuation) != "": gwbush text.append(word.lower()) gwbush\_corpus = [ ] gwbush corpus.append(gwbush text) gwbush dictionary = gensim.corpora.Dictionary(gwbush corpus) gwbush gensim = [ ] for document in gwbush\_corpus: gwbush gensim.append(gwbush dictionary.doc2bow(document)) gwbush\_gensim gwbush\_model = gensim.models.ldamodel.LdaModel(gwbush\_gensim, num topics = 5, id2word = gwbush\_dictionary, passes = 20, iterations = 500, alpha = "asymmetric", random state = 0)for topic in gwbush\_model.print\_topics(num\_words = 10): (0, '0.000\*"iraq" + 0.000\*"terrorist" + 0.000\*"security" + 0.000\*"iraqi" + 0.000\*"freedom" + 0.000\*"c itizen" + 0.000\*"health" + 0.000\*"peace" + 0.000\*"free" + 0.000\*"border"') (1, '0.000\*"iraq" + 0.000\*"terrorist" + 0.000\*"freedom" + 0.000\*"security" + 0.000\*"woman" + 0.000\*"f orce" + 0.000\*"health" + 0.000\*"regime" + 0.000\*"citizen" + 0.000\*"weapon"') (2, '0.008\*"iraq" + 0.006\*"terrorist" + 0.005\*"security" + 0.005\*"freedom" + 0.004\*"citizen" + 0.004 \*"iraqi" + 0.004\*"child" + 0.003\*"peace" + 0.003\*"health" + 0.003\*"force"') (3, '0.000\*"freedom" + 0.000\*"iraq" + 0.000\*"security" + 0.000\*"terrorist" + 0.000\*"child" + 0.000\*"i raqi" + 0.000\*"citizen" + 0.000\*"health" + 0.000\*"human" + 0.000\*"enemy"') (4, '0.000\*"terrorist" + 0.000\*"security" + 0.000\*"iraq" + 0.000\*"freedom" + 0.000\*"citizen" + 0.000 \*"iraqi" + 0.000\*"peace" + 0.000\*"worker" + 0.000\*"woman" + 0.000\*"economy"') Donald Trump In [8]: trump\_path = Path("presidential\_speeches/trump") trump files = [ ] for file in trump\_path.iterdir(): if file.name != ".DS\_Store": trump\_files.append(file) trump\_files with open("output\_file", "w") as outfile: for fname in trump files: with open(fname) as infile: outfile.write(infile.read()) with open("output\_file") as f: trump uncleaned = f.read() trump\_tagged = nltk.pos\_tag(nltk.word\_tokenize(trump\_uncleaned)) trump lemmatized = [ ] for word, tag in trump\_tagged: wntag = penntag\_to\_wordnettag(tag) trump\_lemmatized.append(lemmatizer.lemmatize(word, wntag)) trump\_text = [ ] for word in trump\_lemmatized: if word not in stopwords and word not in common\_terms and len(word) >= 4 and word.strip(string.punc tuation) != "": trump\_text.append(word.lower()) trump\_corpus = [ ] trump corpus.append(trump text) trump\_dictionary = gensim.corpora.Dictionary(trump\_corpus) trump\_gensim = [ ] for document in trump corpus: trump\_gensim.append(trump\_dictionary.doc2bow(document)) trump\_gensim trump model = gensim.models.ldamodel.LdaModel(trump gensim,  $num_topics = 5$ , id2word = trump\_dictionary, passes = 20, iterations = 500, alpha = "asymmetric", random state = 0)for topic in trump\_model.print\_topics(num\_words = 10): print(topic) (0, 0.006\*"deal" + 0.005\*"build" + 0.005\*"money" + 0.005\*"trade" + 0.005\*"wall" + 0.004\*"border" + 0.005\*"trade" + 0.005\*"wall" + 0.005\*"build" + 0.005\*"bui0.004\*"remember" + 0.004\*"change" + 0.004\*"fight" + 0.004\*"mexico"') 1" + 0.000\*"build" + 0.000\*"mexico" + 0.000\*"what" + 0.000\*"trade"') (2, 0.000\*"deal" + 0.000\*"trade" + 0.000\*"build" + 0.000\*"wall" + 0.000\*"money" + 0.000\*"border" + 0.000\*"border\* + 0.000\*"0.000\*"four" + 0.000\*"keep" + 0.000\*"thousand" + 0.000\*"mexico"') (3, '0.000\*"money" + 0.000\*"build" + 0.000\*"trade" + 0.000\*"deal" + 0.000\*"border" + 0.000\*"stop" + 0.000\*"wall" + 0.000\*"hear" + 0.000\*"remember" + 0.000\*"mexico"') (4, '0.000\*"money" + 0.000\*"deal" + 0.000\*"build" + 0.000\*"change" + 0.000\*"wall" + 0.000\*"border" + 0.000\*"border\* + 0.000\*"border\* + 0.000\*"border\* + 0.000\*"border\* + 0.000\*\*"border\* + 0.000\*\*"border\* + 0.00.000\*"remember" + 0.000\*"trade" + 0.000\*"fight" + 0.000\*"everybody"')