### Lab 2

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# 5 Categorizing and Tagging Words

14. Use sorted() and set() to get a sorted list of tags used in the Brown corpus, removing duplicates.

```
Grabbing tagged Text...
Finding unique tags...
Printing 472 tags...
["'",
 11 , , 11 ,
 ,(,,
 '(-HL',
 ')',
 ')-HL',
 '*',
 '*-HL',
 '*-NC',
 '*-TL',
 ,,,
 ',-HL',
 ',-NC',
 ',-TL',
 , <sub>--</sub>,
 '---HL',
 ·. · ,
 '.-HL',
 '.-NC',
 '.-TL',
 ·: · ,
 ':-HL',
 ':-TL',
 'ABL',
 'ABN',
 'ABN-HL',
```

```
'ABN-NC',
'ABN-TL',
'ABX',
'AP',
'AP$',
'AP+AP-NC',
'AP-HL',
'AP-NC',
'AP-TL',
'AT',
'AT-HL',
'AT-NC',
'AT-TL',
'AT-TL-HL',
'BE',
'BE-HL',
'BE-TL',
'BED',
'BED*',
'BED-NC',
'BEDZ',
'BEDZ*',
'BEDZ-HL',
'BEDZ-NC',
'BEG',
'BEM',
'BEM*',
'BEM-NC',
'BEN',
'BEN-TL',
'BER',
'BER*',
'BER*-NC',
'BER-HL',
'BER-NC',
'BER-TL',
'BEZ',
'BEZ*',
'BEZ-HL',
'BEZ-NC',
'BEZ-TL',
'CC',
, CC-HL,
'CC-NC',
'CC-TL',
'CC-TL-HL',
CD',
```

```
'CD$',
'CD-HL',
'CD-NC',
'CD-TL',
^{\prime} CD ^{-} TL ^{-} HL ^{\prime} ,
'CS',
'CS-HL',
'CS-NC',
'CS-TL',
, DO,
'DO*',
'DO*-HL',
'DO+PPSS',
'DO-HL',
'DO-NC',
'DO-TL',
'DOD',
'DOD*',
'DOD*-TL',
'DOD-NC',
'DOZ',
'DOZ*',
'DOZ*-TL',
'DOZ-HL',
'DOZ-TL',
'DT',
'DT$',
'DT+BEZ',
'DT+BEZ-NC',
'DT+MD',
'DT-HL',
'DT-NC',
'DT-TL',
'DTI',
'DTI-HL',
'DTI-TL',
'DTS',
'DTS+BEZ',
'DTS-HL',
'DTX',
'EX',
'EX+BEZ',
'EX+HVD',
'EX+HVZ',
'EX+MD',
'EX-HL',
'EX-NC',
```

```
'FW-*',
'FW-*-TL',
'FW-AT',
'FW-AT+NN-TL',
'FW-AT+NP-TL',
'FW-AT-HL',
'FW-AT-TL',
'FW-BE',
'FW-BER',
'FW-BEZ',
'FW-CC',
'FW-CC-TL',
'FW-CD',
'FW-CD-TL',
'FW-CS',
'FW-DT',
'FW-DT+BEZ',
'FW-DTS',
'FW-HV',
'FW-IN',
'FW-IN+AT',
'FW-IN+AT-T',
'FW-IN+AT-TL',
'FW-IN+NN',
'FW-IN+NN-TL',
'FW-IN+NP-TL',
'FW-IN-TL',
'FW-JJ',
'FW-JJ-NC',
'FW-JJ-TL',
'FW-JJR',
'FW-JJT',
'FW-NN',
'FW-NN$',
'FW-NN$-TL',
'FW-NN-NC',
'FW-NN-TL',
'FW-NN-TL-NC',
'FW-NNS',
'FW-NNS-NC',
'FW-NNS-TL',
'FW-NP',
'FW-NP-TL',
'FW-NPS',
'FW-NPS-TL',
'FW-NR',
'FW-NR-TL',
```

```
'FW-OD-NC',
'FW-OD-TL',
'FW-PN',
'FW-PP$',
'FW-PP$-NC',
'FW-PP$-TL',
'FW-PPL',
'FW-PPL+VBZ',
'FW-PPO',
'FW-PPO+IN',
'FW-PPS',
'FW-PPSS',
'FW-PPSS+HV',
'FW-QL',
'FW-RB',
'FW-RB+CC',
'FW-RB-TL',
'FW-TO+VB',
'FW-UH',
'FW-UH-NC',
'FW-UH-TL',
'FW-VB',
'FW-VB-NC',
'FW-VB-TL',
'FW-VBD',
'FW-VBD-TL',
'FW-VBG',
'FW-VBG-TL',
'FW-VBN',
'FW-VBZ',
'FW-WDT',
'FW-WPO',
'FW-WPS',
'HV',
'HV*',
'HV+TO',
'HV-HL',
'HV-NC',
'HV-TL',
'HVD',
'HVD*',
'HVD-HL',
'HVG',
'HVG-HL',
'HVN',
'HVZ',
'HVZ*',
```

```
'HVZ-NC',
'HVZ-TL',
'IN',
'IN+IN',
'IN+PPO',
'IN-HL',
'IN-NC',
'IN-TL',
'IN-TL-HL',
JJ',
'JJ$-TL',
'JJ+JJ-NC',
'JJ-HL',
'JJ-NC',
'JJ-TL',
'JJ-TL-HL',
'JJ-TL-NC',
'JJR',
'JJR+CS',
'JJR-HL',
'JJR-NC',
'JJR-TL',
'JJS',
'JJS-HL',
'JJS-TL',
'JJT',
'JJT-HL',
'JJT-NC',
'JJT-TL',
'MD',
'MD*',
'MD*-HL',
'MD+HV',
'MD+PPSS',
'MD+TO',
'MD-HL',
'MD-NC',
'MD-TL',
'NIL',
'NN',
'NN$',
'NN$-HL',
'NN$-TL',
'NN+BEZ',
'NN+BEZ-TL',
'NN+HVD-TL',
'NN+HVZ',
```

```
'NN+HVZ-TL',
'NN+IN',
'NN+MD',
'NN+NN-NC',
'NN-HL',
'NN-NC',
'NN-TL',
'NN-TL-HL',
'NN-TL-NC',
'NNS',
'NNS$',
'NNS$-HL',
'NNS$-NC',
'NNS$-TL',
'NNS$-TL-HL',
'NNS+MD',
'NNS-HL',
'NNS-NC',
'NNS-TL',
'NNS-TL-HL',
'NNS-TL-NC',
'NP',
'NP$',
'NP$-HL',
'NP$-TL',
'NP+BEZ',
'NP+BEZ-NC',
'NP+HVZ',
'NP+HVZ-NC',
'NP+MD',
'NP-HL',
'NP-NC',
'NP-TL',
'NP-TL-HL',
'NPS',
'NPS$',
'NPS$-HL',
'NPS$-TL',
'NPS-HL',
'NPS-NC',
'NPS-TL',
'NR',
'NR$',
'NR$-TL',
'NR+MD',
'NR-HL',
'NR-NC',
```

```
'NR-TL',
'NR-TL-HL',
'NRS',
'NRS-TL',
'OD',
'OD-HL',
'OD-NC',
'OD-TL',
'PN',
'PN$',
'PN+BEZ',
'PN+HVD',
'PN+HVZ',
'PN+MD',
'PN-HL',
'PN-NC',
'PN-TL',
'PP$',
'PP$$',
'PP$-HL',
'PP$-NC',
'PP$-TL',
'PPL',
'PPL-HL',
'PPL-NC',
'PPL-TL',
'PPLS',
'PPO',
'PPO-HL',
'PPO-NC',
'PPO-TL',
'PPS',
'PPS+BEZ',
'PPS+BEZ-HL',
'PPS+BEZ-NC',
'PPS+HVD',
'PPS+HVZ',
'PPS+MD',
'PPS-HL',
'PPS-NC',
'PPS-TL',
'PPSS',
'PPSS+BEM',
'PPSS+BER',
'PPSS+BER-N',
'PPSS+BER-NC',
'PPSS+BER-TL',
```

```
'PPSS+BEZ',
'PPSS+BEZ*',
'PPSS+HV',
'PPSS+HV-TL',
'PPSS+HVD',
'PPSS+MD',
'PPSS+MD-NC',
'PPSS+VB',
'PPSS-HL',
'PPSS-NC',
'PPSS-TL',
'QL',
'QL-HL',
'QL-NC',
'QL-TL',
'QLP',
'RB',
'RB$',
'RB+BEZ',
'RB+BEZ-HL',
'RB+BEZ-NC',
'RB+CS',
'RB-HL',
'RB-NC',
'RB-TL',
'RBR',
'RBR+CS',
'RBR-NC',
'RBT',
'RN',
'RP',
'RP+IN',
'RP-HL',
'RP-NC',
'RP-TL',
'TO',
'TO+VB',
'TO-HL',
'TO-NC',
'TO-TL',
'UH',
'UH-HL',
'UH-NC',
'UH-TL',
'VB',
'VB+AT',
'VB+IN',
```

```
'VB+JJ-NC',
'VB+PPO',
'VB+RP',
'VB+TO',
'VB+VB-NC',
'VB-HL',
'VB-NC',
'VB-TL',
'VBD',
'VBD-HL',
'VBD-NC',
'VBD-TL',
'VBG',
'VBG+TO',
'VBG-HL',
'VBG-NC',
'VBG-TL',
'VBN',
'VBN+TO',
'VBN-HL',
'VBN-NC',
'VBN-TL',
'VBN-TL-HL',
'VBN-TL-NC',
'VBZ',
'VBZ-HL',
'VBZ-NC',
'VBZ-TL',
'WDT',
'WDT+BER',
'WDT+BER+PP',
'WDT+BEZ',
'WDT+BEZ-HL',
'WDT+BEZ-NC',
'WDT+BEZ-TL',
'WDT+DO+PPS',
'WDT+DOD',
'WDT+HVZ',
'WDT-HL',
'WDT-NC',
'WP$',
'WPO',
'WPO-NC',
'WPO-TL',
'WPS',
'WPS+BEZ',
'WPS+BEZ-NC',
```

```
'WPS+BEZ-TL',
'WPS+HVD',
'WPS+HVZ',
'WPS+MD',
'WPS-HL',
'WPS-NC',
'WPS-TL',
'WQL',
'WQL-TL',
'WRB',
'WRB+BER',
'WRB+BEZ',
'WRB+BEZ-TL',
'WRB+DO',
'WRB+DOD',
'WRB+DOD*',
'WRB+DOZ',
'WRB+IN',
'WRB+MD',
'WRB-HL',
'WRB-NC',
'WRB-TL',
, ( , , ]
```

- 15. Write programs to process the Brown Corpus and find answers to the following questions:
  - 1. Which nouns are more common in their plural form, rather than their singular form? (Only consider regular plurals, formed with the -s suffix.)
  - 2. Which word has the greatest number of distinct tags. What are they, and what do they represent?
  - 3. List tags in order of decreasing frequency. What do the 20 most frequent tags represent?
  - 4. Which tags are nouns most commonly found after? What do these tags represent?

```
Grabbing tagged Text...
1. Finding mostly plural nouns...
{('barrack', 'barracks'): (1, 2),
  ('bicep', 'biceps'): (1, 3),
  ('ethic', 'ethics'): (4, 6),
  ('headquarter', 'headquarters'): (1, 37),
  ('mean', 'means'): (12, 74),
  ('metaphysic', 'metaphysics'): (3, 11)}
2. Finding word with most distinct tags...
('that',
  {'CS',
```

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'CS-HL',
  'CS-NC',
  'DT',
  'DT-NC',
  'NIL',
  'QL',
  'WPO',
  'WPO-NC',
  'WPS',
  'WPS-HL',
  'WPS-NC'})
3. Listing most common tags...
[('NN', 152470),
 ('IN', 120557),
 ('AT', 97959),
 ('JJ', 64028),
 ('.', 60638),
 (',', 58156),
 ('NNS', 55110),
 ('CC', 37718),
 ('RB', 36464),
 ('NP', 34476),
 ('VB', 33693),
 ('VBN', 29186),
 ('VBD', 26167),
 ('CS', 22143),
 ('PPS', 18253),
 ('VBG', 17893),
 ('PP$', 16872),
 ('TO', 14918),
 ('PPSS', 13802),
 ('CD', 13510)]
4. Finding noun collocations...
22449 ('JJ', 'NN') [(('fiscal', 'year'), 56), (('high', 'school')
   , 54), (('old', 'man'), 52), (('young', 'man'), 47), (('great
   ', 'deal'), 43)]
12288 ('AT', 'NN') [(('the', 'world'), 334), (('a', 'man'), 249),
    (('the', 'time'), 242), (('the', 'way'), 224), (('the', 'end
   ), 203)]
9850 ('JJ', 'NNS') [(('new', 'members'), 30), (('young', 'men'),
   29), (('recent', 'years'), 25), (('American', 'people'), 22),
   (('human', 'beings'), 22)]
8592 ('NN', 'NN') [(('wage', 'rate'), 24), (('index', 'word'),
   21), (('information', 'cell'), 18), (('carbon', 'tetrachloride
   '), 18), (('anode', 'holder'), 18)]
7621 ('IN', 'NN') [(('of', 'course'), 237), (('per', 'cent'),
   146), (('in', 'order'), 129), (('for', 'example'), 109), (('of
```

```
', 'life'), 106)]
4765 ('NN', 'NNS') [(('home', 'runs'), 25), (('index', 'words'),
  21), (('school', 'districts'), 16), (('interest', 'rates'),
  15), (('faculty', 'members'), 14)]
4342 ('PP$', 'NN') [(('his', 'head'), 122), (('his', 'wife'), 93)
   , (('his', 'face'), 72), (('his', 'mind'), 65), (('his', 'life
   '), 63)]
3429 ('IN', 'NNS') [(('of', 'men'), 72), (('in', 'terms'), 72),
   (('of', 'people'), 59), (('of', 'years'), 36), (('at', 'times
   '), 27)]
2762 ('AT', 'NNS') [(('the', 'people'), 113), (('the', 'men'),
  75), (('the', 'others'), 60), (('the', 'children'), 56), (('
  the', 'years'), 48)]
2612 ('CC', 'NN') [(('and', 'Af'), 78), (('and', 'development'),
  23), (('and', 'equipment'), 22), (('and', 'water'), 17), (('
  and', 'wife'), 17)]
2356 ('VBG', 'NN') [(('living', 'room'), 26), (('dining', 'room')
   , 17), (('locking', 'bar'), 10), (('cutting', 'force'), 7),
   (('starting', 'buffer'), 7)]
2069 ('DT', 'NN') [(('this', 'time'), 92), (('that', 'time'), 65)
   , (('this', 'country'), 63), (('this', 'way'), 50), (('this',
   'year'), 49)]
2067 ('VBN', 'NN') [(('taken', 'place'), 11), (('barbed', 'wire')
   , 9), (('aerated', 'lagoon'), 7), (('mixed', 'liquor'), 7),
   (('married', 'life'), 6)]
2035 ('CD', 'NNS') [(('two', 'years'), 58), (('ten', 'years'),
  34), (('two', 'men'), 33), (('five', 'years'), 31), (('two', '
  weeks'), 31)]
1819 ('PP$', 'NNS') [(('his', 'eyes'), 76), (('his', 'hands'),
  53), (('his', 'feet'), 44), (('her', 'eyes'), 35), (('his', '
  lips'), 27)]
1553 ('AP', 'NN') [(('same', 'time'), 94), (('last', 'year'), 68)
   , (('other', 'hand'), 60), (('last', 'night'), 55), (('last',
   'week'), 43)]
1503 (',', 'NN') [((',', 'Af'), 46), ((',', 'sir'), 29), ((',', '
  president'), 21), ((',', 'p'), 19), ((',', 'state'), 16)]
1393 ('AP', 'NNS') [(('few', 'years'), 49), (('few', 'days'), 41)
   , (('many', 'years'), 36), (('few', 'minutes'), 34), (('other
   ', 'words'), 26)]
1374 ('VBG', 'NNS') [(('locking', 'bars'), 9), (('operating', '
  variables'), 8), (('training', 'programs'), 8), (('operating',
    'costs'), 7), (('burning', 'arcs'), 6)]
1346 ('CC', 'NNS') [(('and', 'others
```

- 18. Generate some statistics for tagged data to answer the following questions:
  - 1. What proportion of word types are always assigned the same part-of-speech tag?

- 2. How many words are ambiguous, in the sense that they appear with at least two tags?
- 3. What proportion of word *tokens* in the Brown Corpus involve these ambiguous words?

#### Answer:

```
Grabbing tagged Text...

1. Finding proportion of word types(?) always tagged same...
Proportion Unambiguous: 0.456

2. Finding ambiguous words...
Number Ambiguous: 30498

3. Calculating percentage of ambiguous tokens...
Proportion Ambiguous Tokens: 0.978
```

**35.** Write a program to classify contexts involving the word *must* according to the tag of the following word. Can this be used to discriminate between the epistemic and deontic uses of *must*?

**Answer:** Deontic and Epistemic definitions need to be well-defined first. It appears that many of the categories below might be able to be interpreted into one of the othjer with some degree of reliability.

```
Grabbing tagged Text...
Categorizing...
AT:{
        only must the : RB MD AT
        so must the : RB MD AT
}
ABX: {
        Af must both : NN MD ABX
}
PPSS:{
        times must we : NNS MD PPSS
}
BE-HL:{
        Life must be : NN-HL MD-HL BE-HL
        There must be : EX-HL MD-HL BE-HL
}
VBZ:{
        fans must needs : NNS MD VBZ
}
,:{
        Wagner must , : NP MD ,
        organization must , : NN MD ,
        We must , : PPSS MD ,
        I must , : PPSS MD ,
        and must , : CC MD
        course must , : NN MD ,
```

```
degrees must , : NNS MD ,
        wine must , : NN MD ,
        He must , : PPS MD ,
        He must , : PPS MD
        It must , : PPS MD ,
        We must , : PPSS MD ,
        they must , : PPSS MD ,
        he must , : PPS MD ,
        They must , : PPSS MD ,
        generators must , : NNS MD ,
        gentleman must , : NN MD ,
}
HV-TL:{}
        You Must Have : PPSS-TL MD-TL HV-TL
}
NN:{}
        South must guarantee : NR-TL MD NN
VB-HL:{
        " Must solve : " MD-HL VB-HL
        We must use : PPSS-HL MD-HL VB-HL
}
NIL:{
        obligations must be : NIL NIL NIL
}
VB-TL:{
        Knight Must Fall : NP-TL MD-TL VB-TL
        We Must Join : PPSS-TL MD-TL VB-TL
}
BE:{
        courses must be : NNS MD BE
        sheet must be : NN MD BE
        and must be : CC MD BE
        " must be : " MD BE
        they must be : PPSS MD BE
        offenses must be : NNS MD BE
        we must be : PPSS MD BE
        ye must be : PPSS MD BE
        lay-offs must be : NNS MD BE
        We must be : PPSS MD BE
        deduction must be : NN MD BE
        Requests must be : NNS MD BE
        it must be : PPS MD BE
        there must be : EX MD BE
        method must be : NN MD BE
        problem must be : NN MD BE
        but must be : CC MD BE
```

nevertheless must be : RB MD BE leader must be : NN MD BE crash must be : NN MD BE boost must be : NN MD BE there must be : EX MD BE we must be : PPSS MD BE we must be : PPSS MD BE man must be : NN MD BE it must be : PPS MD BE public must be : NN MD BE course must be : NN MD BE Moloch must be : NP MD BE this must be : DT MD BE there must be : EX MD BE , must be : , MD BE it must be : PPS MD BE it must be : PPS MD BE error must be : NN MD BE two must be : CD MD BE States must be : NNS-TL MD BE man must be : NN MD BE leader must be : NN MD BE babies must be : NNS MD BE thought must be : NN MD BE it must be : PPS MD BE demand must be : NN MD BE This must be : DT MD BE demythologization must be : NN MD BE so must be : RB MD BE it must be : PPS MD BE it must be : PPS MD BE It must be : PPS MD BE You must be : PPSS MD BE It must be : PPS MD BE church must be : NN MD BE Care must be : NN MD BE effect must be : NN MD BE decision must be : NN MD BE decisions must be : NNS MD BE thing must be : NN MD BE , must be : , MD BE You must be : PPSS MD BE You must be : PPSS MD BE You must be : PPSS MD BE target must be : NN MD BE attack must be : NN MD BE forces must be : NNS MD BE

questions must be : NNS MD BE moves must be : NNS MD BE lever must be : NN MD BE bars must be : NNS MD BE pieces must be : NNS MD BE subtraction must be : NN MD BE volume must be : NN MD BE gasket must be : NN MD BE that must be : WPS MD BE tire must be : NN MD BE car must be : NN MD BE measurement must be : NN MD BE measurement must be : NN MD BE that must be : DT MD BE they must be : PPSS MD BE ) must be : ) MD BE divers must be : NNS MD BE bottles must be : NNS MD BE clarity must be : NN MD BE clarity must be : NN MD BE It must be : PPS MD BE and must be : CC MD BE lenses must be : NNS MD BE chest must be : NN MD BE bunk must be : NN MD BE cost must be : NN MD BE roads must be : NNS MD BE material must be : NN MD BE He must be : PPS MD BE work must be : NN MD BE furniture must be : NN MD BE subject must be : NN MD BE also must be : RB MD BE deceased must be : NN MD BE naturally must be : RB MD BE There must be : EX MD BE message must be : NN MD BE journeys must be : NNS MD BE it must be : PPS MD BE Privacy must be : NN MD BE This must be : DT MD BE drama must be : NN MD BE life must be : NN MD BE Livestock must be : NN MD BE that must be : WPS MD BE rent must be : NN MD BE

taxes must be : NNS MD BE

water must be : NN MD BE system must be : NN MD BE therefore must be : RB MD BE writer must be : NN MD BE sea must be : NN MD BE freedom must be : NN MD BE Bantus must be : NPS MD BE lethargy must be : NN MD BE and must be : CC MD BE this must be : DT MD BE ) must be : ) MD BE it must be : PPS MD BE job must be : NN MD BE cities must be : NNS MD BE movement must be : NN MD BE which must be : WDT MD BE Engages must be : FW-NNS MD BE traders must be : NNS MD BE , must be : , MD BE , must be : , MD BE , must be : , MD BE pieces must be : NNS MD BE work must be : NN MD BE right must be : NN MD BE it must be : PPS MD BE action must be : NN MD BE man must be : NN MD BE murder must be : NN MD BE only must be : RB MD BE also must be : RB MD BE sending must be : NN MD BE beings must be : NNS MD BE proprietors must be : NNS MD BE and must be : CC MD BE there must be : EX MD BE protected must be : VBN MD BE it must be : PPO MD BE personality must be : NN MD BE It must be : PPS MD BE she must be : PPS MD BE We must be : PPSS MD BE it must be : PPS MD BE monacle must be : NN MD BE factors must be : NNS MD BE literature must be : NN MD BE it must be : PPS MD BE There must be : EX MD BE

, must be : , MD BE learning must be : VBG MD BE it must be : PPS MD BE they must be : PPSS MD BE it must be : PPS MD BE that must be : WPS MD BE revolts must be : NNS MD BE them must be : PPO MD BE There must be : EX MD BE community must be : NN MD BE , must be : , MD BE unavailable must be : JJ MD BE applicant must be : NN MD BE loan must be : NN MD BE cooperative must be : NN MD BE It must be : PPS MD BE recipients must be : NNS MD BE that must be : WPS MD BE population must be : NN MD BE program must be : NN MD BE It must be : PPS MD BE work must be : NN MD BE countries must be : NNS MD BE They must be : PPSS MD BE They must be : PPSS MD BE , must be : , MD BE it must be : PPS MD BE situation must be : NN MD BE It must be : PPS MD BE force must be : NN MD BE it must be : PPS MD BE percentage must be : NN MD BE , must be : , MD BE share must be : NN MD BE check must be : NN MD BE , must be : , MD BE reports must be : NNS MD BE Means must be : NNS MD BE aim must be : NN MD BE this must be : DT MD BE programs must be : NNS MD BE response must be : NN MD BE warfare must be : NN MD BE forces must be : NNS MD BE care must be : NN MD BE they must be : PPSS MD BE which must be : WDT MD BE

course must be : NN MD BE which must be : WDT MD BE due must be : JJ MD BE request must be : NN MD BE year must be : NN MD BE interest must be : NN MD BE Production must be : NN MD BE it must be : PPS MD BE others must be : NNS MD BE accommodations must be : NNS MD BE Budgeting must be : VBG MD BE he must be : PPS MD BE which must be : WDT MD BE group must be : NN MD BE soil must be : NN MD BE cloth must be : NN MD BE which must be : WDT MD BE there must be : EX MD BE it must be : PPS MD BE parameters must be : NNS MD BE and must be : CC MD BE It must be : PPS MD BE There must be : EX MD BE This must be : DT MD BE anaconda must be : NN MD BE data must be : NNS MD BE di-iodotyrosine must be : NN MD BE , must be : , MD BE there must be : EX MD BE trials must be : NNS MD BE them must be : PPO MD BE f{t} must be : NN MD BE Af must be : NN MD BE F must be : NP MD BE T must be : NP MD BE There must be : EX MD BE bundle must be : NN MD BE regulus must be : NN MD BE \*\*zg must be : NN MD BE they must be : PPSS MD BE communities must be : NNS MD BE tasks must be : NNS MD BE sources must be : NNS MD BE flows must be : NNS MD BE balance must be : NN MD BE It must be : PPS MD BE

there must be : EX MD BE

stress must be : NN MD BE interview must be : NN MD BE worker must be : NN MD BE -- must be : -- MD BE entries must be : NNS MD BE which must be : WDT MD BE sections must be : NNS MD BE arm-levitation must be : NN MD BE response must be : NN MD BE she must be : PPS MD BE cells must be : NNS MD BE chain must be : NN MD BE text must be : NN MD BE that must be : WPS MD BE comments must be : NNS MD BE This must be : DT MD BE 2 must be : CD-TL MD BE usually must be : RB MD BE field must be : NN MD BE configuration must be : NN MD BE rate must be : NN MD BE action must be : NN MD BE claim must be : NN MD BE action must be : NN MD BE claim must be : NN MD BE tax must be : NN MD BE still must be : RB MD BE teacher must be : NN MD BE this must be : DT MD BE rates must be : NNS MD BE , must be : , MD BE it must be : PPS MD BE justice must be : NN MD BE example must be : NN MD BE fanaticism must be : NN MD BE representations must be : NNS MD BE white must be : NN MD BE therefore must be : RB MD BE alienation must be : NN MD BE author must be : NN MD BE components must be : NNS MD BE columns must be : NNS MD BE it must be : PPS MD BE care must be : NN MD BE file must be : NN MD BE entry must be : NN MD BE statement must be : NN MD BE

DIOCS must be : NN MD BE plan must be : NN MD BE principle must be : NN MD BE plan must be : NN MD BE it must be : PPS MD BE it must be : PPS MD BE ) must be : ) MD BE capabilities must be : NNS MD BE values must be : NNS MD BE which must be : WDT MD BE which must be : WDT MD BE and must be : CC MD BE It must be : PPS MD BE states must be : NNS MD BE It must be : PPS MD BE compromise must be : NN MD BE platform must be : NN MD BE accelerometers must be : NNS MD BE axis must be : NN MD BE north must be : NN MD BE itself must be : PPL MD BE that must be : DT MD BE you must be : PPSS MD BE he must be : PPS MD BE , must be : , MD BE You must be : PPSS MD BE these must be : DTS MD BE who must be : WPS MD BE there must be : EX MD BE what must be : WDT MD BE lists must be : NNS MD BE this must be : DT MD BE Nancy must be : NP MD BE it must be : PPS MD BE something must be : PN MD BE there must be : EX MD BE who must be : WPS MD BE and must be : CC MD BE She must be : PPS MD BE

```
hers must be : PP$$ MD BE
        she must be : PPS MD BE
        What must be : WDT MD BE
        , must be : , MD BE
        he must be : PPS MD BE
        There must be : EX MD BE
        he must be : PPS MD BE
        marines must be : NNS MD BE
        she must be : PPS MD BE
        It must be : PPS MD BE
        They must be : PPSS MD BE
        now must be : RB MD BE
        what must be : WDT MD BE
        He must be : PPS MD BE
        house must be : NN MD BE
        it must be : PPS MD BE
        mate must be : NN MD BE
        Susan must be : NP MD BE
        money must be : NN MD BE
        which must be : WDT MD BE
        snapshots must be : NNS MD BE
        bodies must be : NNS MD BE
        It must be : PPS MD BE
}
,,:{
        and must '' : CC MD ''
        " must " : " NN ",
        a must '' : AT NN ''
}
CC:{
        ; must and : . MD CC
        . Must or : . MD CC
}
PP0:{
        Or must it : CC MD PPO
        Jan must you : NP MD PPO
}
ABN:{
        we must all : PPSS MD ABN
}
NP-HL:{
        . Must Berlin : . MD-HL NP-HL
}
D0:{
        we must do : PPSS MD DO
        government must do : NN MD DO
        and must do : CC MD DO
```

they must do : PPSS MD DO they must do : PPSS MD DO They must do : PPSS MD DO we must do : PPSS MD DO } RB:{ You must also : PPSS MD RB children must first : NNS MD RB it must truthfully : PPS MD RB end must somehow: NN MD RB person must also : NN MD RB , must now : , MD RB three must indeed : CD MD RB measure must inevitably : NN MD RB discussed must surely : VBN MD RB We must also : PPSS MD RB One must first : PN MD RB rodder must necessarily : NN MD RB , must first : , MD RB " must also : " MD RB linguist must always : NN MD RB attention must also: NN MD RB jaws must necessarily : NNS MD RB  $\hbox{\tt man must first : NN MD RB}$ what must always : WDT MD RB we must never : PPSS MD RB they must always : PPSS MD RB There must first : EX MD RB congressman must constantly : NN MD RB we must certainly : PPSS MD RB love-in-action must first : NN MD RB There must also : EX MD RB " must surely : " MD RB what must still : WDT MD RB perception must immediately : NN MD RB religion must also : NN MD RB ambitions must always : NNS MD RB he must now: PPS MD RB we must first : PPSS MD RB we must squarely : PPSS MD RB Salem must frequently : NP MD RB '' must always : '' MD RB I must then: PPSS MD RB list must naturally : NN MD RB bishops must never : NNS MD RB Shakespeare must often : NP MD RB

historian must never : NN MD RB

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merchants must constantly : NNS MD RB
        they must also: PPSS MD RB
        and must often : CC MD RB
        areas must necessarily : NNS MD RB
        judgment must therefore : NN MD RB
        he must also : PPS MD RB
        we must always : PPSS MD RB
        productivity must inevitably : NN MD RB
        president must also : NN MD RB
        plan must therefore : NN MD RB
        we must still : PPSS MD RB
        We must now: PPSS MD RB
        we must first : PPSS MD RB
        civilization must formally : NN MD RB
        succession must also : NN MD RB
        he must also : PPS MD RB
        which must therefore : WDT MD RB
        costs must somehow: NNS MD RB
        then must somehow: RB MD RB
        we must first : PPSS MD RB
        we must now: PPSS MD RB
        , must necessarily : , MD \ensuremath{\mathtt{RB}}
        epithets must reasonably : NNS MD RB
        humorous must therefore : JJ MD RB
        variations must eventually : NNS MD RB
        operator must continually : NN MD RB
        He must mentally : PPS MD RB
        Music must now: NN-TL MD RB
        Purdew must once : NP MD RB
        Central must eventually : JJ-TL MD RB
        town must still : NN MD RB
        hair must still : NN MD RB
NNS: {
        . Must records : . MD NNS
PPS:{
        neither must she : CC MD PPS
        , must she : , MD PPS
IN:{
        a must for : AT NN IN
        hearings must at : NNS MD IN
        a must for : AT NN IN
        machinery must in : NN MD IN
        They must in : PPSS MD IN
```

}

}

}

history must always : NN MD RB

```
we must at : PPSS MD IN
}
RB-HL:{
        minors must also : NNS-HL MD-HL RB-HL
}
PPLS:{
        we must ourselves : PPSS MD PPLS
}
VB:{
        county must sign : NN MD VB
        Republicans must hold: NPS MD VB
        We must solve : PPSS MD VB
        council must establish : NN MD VB
        '' Must share : '' MD VB
        Democrats must resolve : NPS MD VB
        We must keep: PPSS MD VB
        apparently must make : RB MD VB
        We must persuade : PPSS MD VB
        States must plan : NNS-TL MD VB
        You must play : PPSS MD VB
        it must accomplish : PPS MD VB
        we must stay : PPSS MD VB
        agency must train : NN MD VB
        We must justify : PPSS MD VB
        we must get : PPSS MD VB
        company must apply : NN MD VB
        you must wear : PPSS MD VB
        law must treat : NN MD VB
        equality must forbid : NN MD VB
        it must compete : PPS MD VB
        it must play : PPS MD VB
        libraries must face : NNS MD VB
        one must cherish : PN MD VB
        world must acquiesce : NN MD VB
        He must show: PPS MD VB
        it must deal : PPS MD VB
        labor must learn : NN MD VB
        , must develop : , MD VB
        we must confess : PPSS MD VB
        project must undergo: NN MD VB
        person must pass : NN MD VB
        community must stand : NN MD VB
        DuPont must divest : NP MD VB
        who must transfer : WPS MD VB
        ads must get : NNS MD VB
        who must take : WPS MD VB
        we must embark : PPSS MD VB
```

escalation must end : NN MD VB too must start : RB MD VB States must choose : NNS-TL MD VB question must arise : NN MD VB yourself must seek : PPL MD VB they must depend : PPSS MD VB this must sound : DT MD VB I must say : PPSS MD VB song must contribute : NN MD VB one must go: PN MD VB one must build : PN MD VB one must wonder : PN MD VB prestige must lead : NN MD VB leader must strengthen: NN MD VB world must become : NN MD VB we must number : PPSS MD VB ourselves must strive : PPLS MD VB man must recognize : NN MD VB I must speak : PPSS MD VB one must belong : PN MD VB we must keep: PPSS MD VB He must learn : PPS MD VB Committee must follow : NN-TL MD VB they must find : PPSS MD VB it must rule : PPS MD VB we must learn : PPSS MD VB We must claim : PPSS MD VB prominent must serve : JJ MD VB thou must give : PPSS MD VB we must use : PPSS MD VB we must take : PPSS MD VB We must determine : PPSS MD VB We must make : PPSS MD VB which must dominate : WDT MD VB junior must win : NN MD VB you must apply : PPSS MD VB you must present : PPSS MD VB you must file : PPSS MD VB You must know: PPSS MD VB they must study : PPSS MD VB gymnast must develop: NN MD VB that must come : WPS MD VB man must revel : NN MD VB he must understand: PPS MD VB We must build : PPSS MD VB he must select : PPS MD VB They must learn: PPSS MD VB

He must undertake : PPS MD VB man must read : NN MD VB dealers must earn : NNS MD VB therapist must know: NN MD VB else must know : RB MD VB theory must seem : NN MD VB fiction must travel : NN MD VB care must take : NN MD VB Everything must balance: PN MD VB you must get : PPSS MD VB We must realize : PPSS MD VB vagina must dilate : NN MD VB generally must lie : RB MD VB husband must take : NN MD VB He must begin : PPS MD VB He must become : PPS MD VB he must spend : PPS MD VB sitter must decide : NN MD VB ) must mark : ) MD VB farmer must get : NN MD VB he must work : PPS MD VB generally must pay : RB MD VB you must keep : PPSS MD VB settlement must depend : NN MD VB you must forgive : PPSS MD VB he must realize : PPS MD VB , must defer : , MD VB we must choose : PPSS MD VB we must fight : PPSS MD VB we must remember : PPSS MD VB who must deal : WPS MD VB man must attend : NN MD VB he must go: PPS MD VB growth must go: NN MD VB one must admit : PN MD VB education must start : NN MD VB ecumenical must meet : JJ MD VB ecumenical must become : JJ MD VB we must emphasize : PPSS MD VB something must seep : PN MD VB and must conform : CC MD VB , must follow : , MD  $\ensuremath{\mathtt{VB}}$ and must serve : CC MD VB Indians must bring: NPS MD VB He must take : PPS MD VB we must become : PPSS MD VB Each must match : DT MD VB

three must compare : CD MD VB who must run : WPS MD VB nose must deny : NN MD VB Negro must discover : NP MD VB South must grapple : NR-TL MD VB farmer must perform : NN MD VB yearly must readjust : RB MD VB composer must select : NN MD VB I must reach : PPSS MD VB else must follow : RB MD VB metamorphosis must come : NN MD VB choreographer must arbitrate : NN MD VB He must rearrange : PPS MD VB He must construct : PPS MD VB that must fall : WPS MD VB one must let : PN MD VB one must speak : PN MD VB she must justify: PPS MD VB they must move : PPSS MD VB I must confess : PPSS MD VB ye must stagger : PPSS MD VB detective must save : NN MD VB he must abandon : PPS MD VB We must believe : PPSS MD VB we must employ : PPSS MD VB Businesses must develop: NNS MD VB they must become : PPSS MD VB government must establish : NN MD VB we must turn : PPSS MD VB it must grow : PPS MD VB , must make : , MD VB , must say : , MD VB I must stand : PPSS MD VB I must tell : PPSS MD VB I must make : PPSS MD VB we must watch : PPSS MD VB I must devote : PPSS MD VB nations must extend : NNS MD VB We must meet : PPSS MD VB we must induce : PPSS MD VB we must co-operate : PPSS MD VB we must act : PPSS MD VB we must maintain : PPSS MD VB makers must make : NNS MD VB whole must decide : NN MD VB this must stand : DT MD VB we must think : PPSS MD VB

it must sever : PPS MD VB we must admit : PPSS MD VB , must center : , MD VB it must seek : PPS MD VB we must remember: PPSS MD VB We must avoid : PPSS MD VB I must hurry : PPSS MD VB we must go : PPSS MD VB I must go: PPSS MD VB man must take : NN MD VB we must examine : PPSS MD VB theater must stand : NN MD VB , must create : , MD VB we must prove : PPSS MD VB we must construe : PPSS MD VB we must find : PPSS MD VB historian must consider : NN MD VB he must regard : PPS MD VB he must recognize : PPS MD VB he must expect : PPS MD VB we must add : PPSS MD VB , must set : , MD VB one must act : PN MD VB we must attend : PPSS MD VB we must carry : PPSS MD VB , must develop : , MD VB community must lead : NN MD VB we must develop : PPSS MD VB he must battle : PPS MD VB detective must rely : NN MD VB He must become : PPS MD VB and must meet : CC MD VB future must indicate : NN MD VB and must meet : CC MD VB it must express : PPS MD VB development must come : NN MD VB we must encourage : PPSS MD VB they must plan : PPSS MD VB world must rise : NN MD VB state must raise : NN MD VB , must give : , MD VB We must ask : PPSS MD VB enforcement must accommodate : NN MD VB Department must think: NN-TL MD VB we must think : PPSS MD VB we must act : PPSS MD VB he must give : PPS MD VB

He must think : PPS MD VB principles must take : NNS MD VB He must deal : PPS MD VB He must think : PPS MD VB objectives must conform : NNS MD VB readiness must take : NN MD VB you must place : PPSS MD VB representative must file : NN MD VB application must include : NN MD VB You must attach : PPSS MD VB he must file : PPS MD VB -- must remain : -- MD VB artist must cross : NN MD VB which must compete : WDT MD VB it must concentrate : PPS MD VB student must attend : NN MD VB president must involve : NN MD VB university must know: NN MD VB universities must consider : NNS MD VB , must account : , MD VB gas must come : NN MD VB , must sputter : , MD VB one must expect : PN MD VB One must include : PN MD VB I must add : PPSS MD VB I must plead : PPSS MD VB mechanism must exist : NN MD VB one must examine : PN MD VB one must know: PN MD VB one must know : PN MD VB trial must result : NN MD VB Af must cross : NN MD VB set must consist : NN MD VB Af must coincide : NN MD VB we must reject : PPSS MD VB They must continue : PPSS MD VB countries must formulate : NNS MD VB developments must take : NNS MD VB and must become : CC MD VB society must generate : NN MD VB worker must demonstrate : NN MD VB worker must communicate : NN MD VB knowledge must determine : NN MD VB analysis must take : NN MD VB we must define : PPSS MD VB which must support : WDT MD VB districts must pay : NNS MD VB

they must pay : PPSS MD VB opposition must persist : NN MD VB few must win : AP MD VB we must relate : PPSS MD VB profession must work : NN MD VB one must distinguish : PN MD VB we must distinguish : PPSS MD VB company must incur : NN MD VB we must keep: PPSS MD VB and must hope : CC MD VB I must postpone : PPSS MD VB we must consider : PPSS MD VB which must move : WDT MD VB one must work : PN MD VB there must remain : EX MD VB we must make : PPSS MD VB who must suffer : WPS MD VB whole must remain : NN MD VB he must improvise : PPS MD VB Pip must learn : NP MD VB operand must begin : NN MD VB exchange must result : NN MD VB targets must come : NNS MD VB preservation must accomplish : NN MD VB tests must determine : NNS MD VB stages must use : NNS MD VB decisions must constitute : NNS MD VB , must use : , MD VB we must wait : PPSS MD VB they must look : PPSS MD VB he must leave : PPS MD VB he must receive : PPS MD VB place must go: NN MD VB he must go : PPS MD VB he must follow : PPS MD VB he must pray : PPS MD VB You must make : PPSS MD VB he must seem : PPS MD VB I must pretend : PPSS MD VB I must state : PPSS MD VB city must rid : NN MD VB Geneva must remain : NP MD VB , must belong : , MD VB she must hold : PPS MD VB sculpture must take : NN MD VB peace must come : NN MD VB I must admit : PPSS MD VB

Kayabashi must feel : NP MD VB girls must take : NNS MD VB he must take : PPS MD VB who must take : WPS MD VB People must think : NNS MD VB one must make : PN MD VB it must link : PPS MD VB you must forgive : PPSS MD VB You must know: PPSS MD VB I must tell : PPSS MD VB I must tell : PPSS MD VB vou must know: PPSS MD VB You must understand: PPSS MD VB we must know: PPSS MD VB he must express : PPS MD VB , must envy : , MD VB he must chance : PPS MD VB You must forgive : PPSS MD VB I must say : PPSS MD VB he must observe : PPS MD VB Everything must wait : PN MD VB ourselves must stand : PPLS MD VB he must act : PPS MD VB I must talk : PPSS MD VB but must stand : CC MD VB which must follow: WDT MD VB everyone must justify : PN MD VB you must flog : PPSS MD VB you must tell : PPSS MD VB God must look : NP MD VB I must remember : PPSS MD VB I must answer : PPSS MD VB ours must look : PP\$\$ MD VB } .:{ you must . : PPSS MD . } \*:{ we must not : PPSS MD \* Education must not : NN MD \* We must not : PPSS MD \* warnings must not : NNS MD \* and must not : CC MD \* one must not : PN MD \* it must not : PPS MD \* we must not : PPSS MD \*

I must know: PPSS MD VB

There must not : EX MD \* it must not : PPS MD \* We must not : PPSS MD \* living must not : VBG MD \* it must not : PPS MD \* citizens must not : NNS MD \* he must not : PPS MD \* He must not : PPS MD \* I must not : PPSS MD \* I must not : PPSS MD \* Israelites must not : NPS MD \* She must not : PPS MD \* we must not : PPSS MD  $\ast$ HV:{ people must have : NNS MD HV We must have : PPSS MD HV coeds must have : NNS MD HV they must have : PPSS MD HV both must have : ABX MD HV it must have : PPS MD HV General must have : JJ-TL MD HV we must have : PPSS MD HV what must have : WDT MD HV himself must have : PPL MD HV start must have : NN MD HV it must have : PPS MD HV you must have : PPSS MD HV some must have : DTI MD HV Centrality must have : NN-TL MD HV family must have : NN MD HV it must have : PPS MD HV we must have : PPSS MD HV we must have : PPSS MD HV them must have : PPO MD HV it must have : PPS MD HV reporter must have : NN MD HV boards must have : NNS MD HV vou must have : PPSS MD HV teacher must have : NN MD HV course must have : NN MD HV school must have : NN MD HV she must have : PPS MD HV it must have : PPS MD HV what must have : WDT MD HV , must have : , MD HV This must have : DT MD HV

}

feels must have : VBZ MD HV who must have : WPS MD HV She must have : PPS MD HV which must have : WDT MD HV what must have : WDT MD HV You must have : PPSS MD HV imagery must have : NN MD HV we must have : PPSS MD HV men must have : NNS MD HV men must have : NNS MD HV they must have : PPSS MD HV Bang-Jensen must have : NP MD HV work must have : NN MD HV he must have : PPS MD HV dispatch must have : NN MD HV silence must have : NN MD HV she must have : PPS MD HV , must have : , MD HV magistrates must have : NNS MD HV it must have : PPS MD HV There must have : EX MD HV troops must have : NNS MD HV I must have : PPSS MD HV town must have : NN MD HV generation must have : NN MD HV applicant must have : NN MD HV Central must have : JJ-TL MD HV entrance must have : NN MD HV It must have : PPS MD HV team must have : NN MD HV which must have : WDT MD HV snake must have : NN MD HV space must have : NN MD HV it must have : PPS MD HV trials must have : NNS MD HV Af must have : NN MD HV locus must have : NN MD HV \*\*zg must have : NN MD HV countries must have : NNS MD HV there must have : EX MD HV it must have : PPS MD HV These must have : DTS MD HV these must have : DTS MD HV commander must have : NN MD HV he must have : PPS MD HV they must have : PPSS MD HV you must have : PPSS MD HV

Juanita must have : NP MD HV Eileen must have : NP MD HV she must have : PPS MD HV thoughts must have : NNS MD HV she must have : PPS MD HV that must have : WPS MD HV it must have : PPS MD HV You must have : PPSS MD HV voice must have : NN MD HV soldiers must have : NNS MD HV cars must have : NNS MD HV and must have : CC MD HV , must have : , MD HV who must have : WPS MD HV . Must have : . MD HV He must have : PPS MD HV certainly must have : RB MD HV It must have : PPS MD HV skepticism must have : NN MD HV he must have : PPS MD HV himself must have : PPL MD HV we must have : PPSS MD HV and must have : CC MD HV It must have : PPS MD HV It must have : PPS MD HV Carmer must have : NP MD man must have : NN MD HV I must have : PPSS MD HV he must have : PPS MD HV He must have : PPS MD HV He must have : PPS MD HV Ruffians must have : NNS MD HV she must have : PPS MD HV He must have : PPS MD HV who must have : WPS MD HV she must have : PPS MD HV he must have : PPS MD HV he must have : PPS MD HV Via must have : NP MD HV She must have : PPS MD HV what must have : WDT MD HV You must have : PPSS MD HV he must have : PPS MD HV She must have : PPS MD HV John must have : NP MD HV You must have : PPSS MD HV and must have : CC MD HV

```
I must have : PPSS MD HV
She must have : PPS MD HV
she must have : PPS MD HV
He must have : PPS MD HV
. Must have : MD HV
factor must have : NN MD HV
actor must have : NN MD HV
You must have : PPSS MD HV
you must have : PPSS MD HV
which must have : WDT MD HV
```

## 6 Learning to Classify Text

3. The Senseval 2 Corpus contains data intended to train word-sense disambiguation classifiers. It contains data for four words: hard, interest, line, and serve. Choose one of these four words, and load the corresponding data:

```
>>> from nltk.corpus import senseval
>>> instances = senseval.instances('hard.pos')
>>> size = int(len(instances) * 0.1)
>>> train_set, test_set = instances[size:], instances[:size]
```

Using this dataset, build a classifier that predicts the correct sense tag for a given instance. See the corpus HOWTO at http://nltk.org/howto for information on using the instance objects returned by the Senseval 2 Corpus.

#### Answer:

}

```
Training...
Testing...
Accuracy: 0.589
```

**6.** The synonyms *strong* and *powerful* pattern differently (try combining them with *chip* and *sales*). What features are relevant in this distinction? Build a classifier that predicts when each word should be used.

**Answer:** It may be obvious, but the surrounding words and their POS are used as features in this dataset.

```
Grabbing tagged Text...
Finding contexts...
Building datasets...
Training...
Accuracy: 0.930
Most Informative Features
```

### Jurafsky and Martin

### 4 N-Grams

2. Write a program to compute unsmoothed unigrams and bigrams.

```
590: DEBUG: Tokenizing...
2016-10-26 23:47:52,590:DEBUG:Loading text...
2016-10-26 23:47:52,590:DEBUG:Loading JSON as dictionary:'
   trumpTextRaw.json'
2016-10-26 23:47:55,020:DEBUG:Unigrams...
2016-10-26 23:47:55,163:DEBUG:Bigrams...
Num Words: 344325
[('Our',),
 ('campaign',),
 ('is',),
 ('powered',),
 ('by',),
 ('our',),
 ('love',),
 ('for',),
 ('this',),
 ('country',),
 ('and',),
 ('our',),
 ('love',),
 ('for',),
 ('our',),
 ('fellow',),
 ('citizens',),
 ('.',),
 ('And',),
 ('is',)]
```

```
[('Our', 'campaign'),
 ('campaign', 'is'),
('is', 'powered'),
 ('powered', 'by'),
 ('by', 'our'),
 ('our', 'love'),
 ('love', 'for'),
 ('for', 'this'),
 ('this', 'country'),
 ('country', 'and'),
 ('and', 'our'),
 ('our', 'love'),
('love', 'for'),
 ('for', 'our'),
 ('our', 'fellow'),
 ('fellow', 'citizens'),
 ('citizens', '.'),
 ('.', 'And'),
 ('And', 'is'),
 ('is', 'there')]
```

**3.** Run your N-gram program on two different small corpora of your choice (you might use email text or newsgroups). Now compare the statistics of the two corpora. What are the differences in the most common unigrams between the two? How about interesting differences in bigrams?

```
: [(('to', 'be'), 595),
25 Most Common for Austen's Emma
 (('of', 'the'), 557),
 (('in', 'the'), 434),
 (('I', 'am'), 395),
 (('had', 'been'), 308),
 (('Mr', 'Knightley'), 299),
 (('it', 'was'), 287),
 (('I', 'have'), 281),
 (('could', 'not'), 277),
 (('of', 'her'), 262),
 (('Mrs', 'Weston'), 256),
 (('she', 'had'), 254),
 (('--', 'and'), 245),
 (('have', 'been'), 243),
 (('to', 'the'), 236),
 (('Mr', 'Elton'), 229),
 ((',"', 'said'), 225),
 (('she', 'was'), 218),
 (('and', 'the'), 218),
 (('would', 'be'), 216),
 (('do', 'not'), 203),
```

```
(('it', 'is'), 194),
 (('of', 'his'), 191),
 (('a', 'very'), 185),
 (('to', 'her'), 185)]
25 Most Common for Shakespear's Macbeth: [(('I', 'haue'), 41),
 (('I', 'am'), 29),
 (('of', 'the'), 24),
 (('to', 'the'), 24),
 (('my', 'Lord'), 20),
 (('in', 'the'), 20),
 (('Thane', 'of'), 18),
 (('and', 'the'), 17),
 (('ha', 's'), 17),
 (('do', 's'), 15),
 (('to', 'be'), 15),
 (('Exeunt', 'Scena'), 15),
 (('I', 'will'), 15),
 (('Enter', 'Macbeth'), 15),
 (('no', 'more'), 15),
(('of', 'my'), 15),
 (('i', 'th'), 14),
 (('of', 'Cawdor'), 14),
 (('in', 'his'), 13),
 (('Macb', 'I'), 13),
 (('o', 'th'), 13),
 (('Thane', 'of', 'Cawdor'), 13),
 (('the', 'time'), 12),
 (('What', 'is'), 12),
 (('d', 'with'),
```

**4.** Add an option to your program to generate random sentences.

```
[jmcgover@MAINFRAME 2lab]$ for i in {1..5}; do python lab2-jm4.4.

py; done
It is so resolutely and Miss Taylor away with her own pleasure
the same, and till a simple style of Mrs.

Weston was such a longer -- Who cried Emma was prone to be heard
."" He gave her immediate feeling was in half an act of poor
girl who were the only could catch myself, at -- tacitly
brought up her own wish, and his attentions and then, that Mr.

What was not the story, I come with the advantage of Mrs.

I am convinced that in fact by this sentiment which produced the
closest agreement with Mr.

I need not poignant enough to Donwell for her to you -- but she
replied, did not be subject as your forbearance.

[jmcgover@MAINFRAME 2lab]$
```

**9.** (Advanced) Suppose someone took all the words in a sentence and reordered them randomly. Write a program that takes as input such a **bag of words** and produces as output a guess at the original order. You will need to use an N-gram grammar produced by your N-gram program (on some corpus), and you will need to use the Viterbi algorithm introduced in the next chapter. This task is sometimes called **bag generation**.