



# Introduction To PUNKT Model using NLTK

```
In [1]: import nltk  
from nltk.tokenize import word_tokenize, sent_tokenize  
from prettytable import PrettyTable
```

```
In [2]: nltk.download('punkt_tab')  
  
[nltk_data] Downloading package punkt_tab to  
[nltk_data]     C:\Users\Uditya\AppData\Roaming\nltk_data...  
[nltk_data]     Package punkt_tab is already up-to-date!
```

```
Out[2]: True
```

```
In [3]: text = "It's a dangerous business, Frodo, going out your door. You step onto t
```

```
In [4]: words = word_tokenize(text)  
sentence = sent_tokenize(text)
```

```
In [5]: # words  
sentence
```

```
Out[5]: ["It's a dangerous business, Frodo, going out your door.",  
        "You step onto the road, and if you don't keep your feet, there's no knowing  
        where you might be swept off to."]
```

## Filtering Stop Words

```
In [6]: from nltk.corpus import stopwords  
import spacy
```

```
In [7]: nltk.download('stopwords')  
  
[nltk_data] Downloading package stopwords to  
[nltk_data]     C:\Users\Uditya\AppData\Roaming\nltk_data...  
[nltk_data]     Package stopwords is already up-to-date!
```

```
Out[7]: True
```

```
In [8]: stop_words = stopwords.words('english')
```

```
In [9]: print(stop_words)
```

```
['a', 'about', 'above', 'after', 'again', 'against', 'ain', 'all', 'am', 'an', 'and', 'any', 'are', 'aren', "aren't", 'as', 'at', 'be', 'because', 'been', 'before', 'being', 'below', 'between', 'both', 'but', 'by', 'can', 'couldn', "couldn't", 'd', 'did', 'didn', "didn't", 'do', 'does', 'doesn', "doesn't", 'doing', 'don', "don't", 'down', 'during', 'each', 'few', 'for', 'from', 'further', 'had', 'hadn', "hadn't", 'has', 'hasn', "hasn't", 'have', 'haven', "haven't", 'having', 'he', "he'd", "he'll", 'her', 'here', 'hers', 'herself', "he's", 'him', 'himself', 'his', 'how', 'i', "i'd", 'if', "i'll", "i'm", 'in', 'into', 'is', 'isn', "isn't", 'it', "it'd", "it'll", "it's", 'its', 'itself', "i've", 'just', 'll', 'm', 'ma', 'me', 'mightn', "mightn't", 'more', 'most', 'mustn', "mustn't", 'my', 'myself', 'needn', "needn't", 'no', 'nor', 'not', 'now', 'o', 'of', 'off', 'on', 'once', 'only', 'or', 'other', 'our', 'ours', 'ourselves', 'out', 'over', 'own', 're', 's', 'same', 'shan', "shan't", 'she', "she'd", "she'll", "she's", 'should', 'shouldn', "shouldn't", "should've", 'so', 'some', 'such', 't', 'than', 'that', "that'll", 'the', 'their', 'theirs', 'them', 'themselves', 'then', 'there', 'these', 'they', "they'd", "they'll", "they're", "they've", 'this', 'those', 'through', 'to', 'too', 'under', 'until', 'up', 've', 'very', 'was', 'wasn', "wasn't", 'we', "we'd", "we'll", "we're", 'were', 'weren', "weren't", "we've", 'what', 'when', 'where', 'which', 'while', 'who', 'whom', 'why', 'will', 'with', 'won', "won't", 'wouldn', "wouldn't", 'y', 'you', "you'd", "you'll", 'your', "you're", 'yours', 'yourself', 'yourselves', "you've"]
```

```
In [10]: nlp = spacy.load('en_core_web_sm')
spacy_stop_words = nlp.Defaults.stop_words
```

```
In [11]: print(spacy_stop_words)
```

```
{'really', 'back', 'twenty', 'using', "'ll", 'had', 'and', 'becoming', 'made',  
'anywhere', 'bottom', 'thereupon', 'under', 'beyond', 'part', 'during', 'namel  
y', 'sometime', 'whither', "'ve", 'becomes', 'done', 'us', 'twelve', 'each', 't  
op', 'seem', 'an', 'did', 'were', 'should', "'s", 'after', 'thereby', 'from',  
'every', 'became', 'eight', 'several', 'please', 'itself', 'him', 'n't', 'up',  
'throughout', 'them', 'besides', 'among', 'because', "'ve", 'nobody', 'mine',  
'doing', 'last', 'whole', 'have', 'still', 'whereby', 'ours', 'take', 'amount',  
'seemed', 'once', 'often', 'nor', 'therefore', 'a', 'too', "'d", "'d", 'almos  
t', 'nowhere', 'five', 'seems', 'whose', 'into', 'toward', 'anyway', 'could',  
'nine', 'two', 'how', 'behind', 'all', "'re", 'meanwhile', 'he', 'ten', 'everyo  
ne', 'anyhow', 'towards', 'used', "'m", 'see', 'without', 'though', 'until', 'h  
ereupon', 'also', 'due', 'been', 'can', 'you', 'former', "'ve", 'another', 'aft  
erwards', 'anything', 'between', 'wherein', 'hereafter', 'at', 'eleven', 'becom  
e', 'yourself', 'cannot', 'ca', 'they', 'their', 'which', 'whence', 'whenever',  
'well', "'s", 'latter', 'it', 'therein', 'rather', 'we', 'so', 'those', 'alon  
e', 'whereafter', 'thru', 'serious', 'was', 'whoever', 'not', 'with', 'already',  
'than', 'very', 'out', 'same', 'both', 'give', 'whereas', 'the', 'next', 'a  
gain', 'call', 'someone', 'for', 'hers', 'would', "'ll", 'no', 'herein', 'belo  
w', 'neither', 'elsewhere', "'d", 'why', 'fifty', 'down', 'few', 'either', 'eve  
rywhere', 'first', 'is', 'herself', 'now', 'about', 'empty', 'thence', 'unles  
s', 'has', 'much', 'on', "n't", 'she', 'whom', 'his', 'regarding', 'n't', 'alwa  
ys', 'moreover', 'sometimes', 'do', 'yours', 'my', 'somewhere', 'to', 'whereupo  
n', "'re", "'s", 'upon', 'whether', 'enough', 'whatever', 'else', 'what', 'ont  
o', "'m", 'otherwise', 'via', 'per', 'of', 'then', 'everything', 'such', 'himse  
lf', 'say', 'go', 'somehow', 'while', 'over', 'latterly', 'none', 'are', "'ll",  
'three', 'in', 'across', 'show', 'own', 'noone', 'themselves', 'anyone', 'whe  
n', 'yet', 'thereafter', 'indeed', 'wherever', 'forty', 'even', 'nothing', 'nev  
er', 'myself', 'may', 'although', 're', 'other', 'six', 'along', 'if', 'just',  
'beforehand', 'before', 'some', 'move', 'yourselves', 'most', 'who', 'hereby',  
'name', 'might', 'four', 'make', 'this', 'be', 'ever', 'but', 'must', 'amongst',  
'mostly', 'being', 'various', 'perhaps', 'me', 'sixty', 'these', 'ourselv  
es', 'above', 'will', 'get', 'against', 'together', 'third', 'does', 'others',  
'through', 'fifteen', 'put', 'side', 'less', 'am', 'formerly', 'least', 'furthe  
r', 'seeming', 'keep', 'here', 'one', 'front', 'its', 'within', 'i', 'that', 'b  
eside', 'by', 'hence', 'full', 'since', 'except', 'there', 'only', 'more', 'o  
r', 'hundred', 'many', 'around', 'nevertheless', 'as', 'her', 'off', 'however',  
'your', 'quite', 'thus', "'m", 'something', 'where', "'re', 'any', 'our'}
```

```
In [12]: len(stop_words), len(spacy_stop_words)
```

```
Out[12]: (198, 326)
```

```
In [13]: text = "Docker and Docker Compose have become essential tools for developers a
```

```
In [14]: words = word_tokenize(text.lower())
```

```
In [15]: sw_len = set([word for word in words if word in stop_words])  
len(sw_len)
```

```
Out[15]: 28
```

```
In [16]: print(sw_len)
```

```
{'or', 'of', 'll', 'once', 'most', 'will', 'and', 'up', 'out', 'this', 're', 'b  
e', 'a', 'each', 'is', 'through', 'an', 'your', 'have', 'the', 'can', 'we', 'i  
n', 'you', 'to', 'some', 'for', 'on'}
```

## Stemming

```
In [17]: from nltk.stem import PorterStemmer  
text = 'The scientists discover new species every year, Last year, they discov  
In [18]: stemmer = PorterStemmer()  
words = word_tokenize(text)  
stemmed_words = [stemmer.stem(word) for word in words]  
  
print(stemmed_words)  
['the', 'scientist', 'discov', 'new', 'speci', 'everi', 'year', ',', 'last', 'y  
ear', ',', 'they', 'discov', 'an', 'ancient', 'artifact', '.', 'they', 'are',  
'discov', 'new', 'techniqu', 'with', 'their', 'recent', 'discoveri']  
In [19]: from prettytable import PrettyTable  
table = PrettyTable()  
table.field_names = ['word', 'stemmed word']  
for word, stw in zip(words, stemmed_words):  
    table.add_row([word, stw])  
  
print(table)
```

word	stemmed word
The	the
scientists	scientist
discover	discov
new	new
species	speci
every	everi
year	year
,	,
Last	last
year	year
,	,
they	they
discovered	discov
an	an
ancient	ancient
artifact	artifact
.	.
they	they
are	are
discovering	discov
new	new
techniques	techniqu
with	with
their	their
recent	recent
discovery	discoveri

## Pos Tagging

```
In [20]: from nltk import pos_tag
```

```
In [21]: nltk.download('averaged_perceptron_tagger')
```

```
[nltk_data] Downloading package averaged_perceptron_tagger to
[nltk_data]     C:\Users\Uditya\AppData\Roaming\nltk_data...
[nltk_data]     Package averaged_perceptron_tagger is already up-to-
[nltk_data]         date!
```

```
Out[21]: True
```

```
In [22]: tagged_words = pos_tag(words)
```

```
In [23]: nltk.download('tagsets_json')
```

```
[nltk_data] Downloading package tagsets_json to
[nltk_data]     C:\Users\Uditya\AppData\Roaming\nltk_data...
[nltk_data]     Package tagsets_json is already up-to-date!
```

Out[23]: True

In [24]: `nltk.help.upenn_tagset()`

\$: dollar  
\$ - \$ --\$ A\$ C\$ HK\$ M\$ NZ\$ S\$ U.S.\$ US\$  
': closing quotation mark  
' ''

(: opening parenthesis  
( [ {  
) closing parenthesis  
) ] }  
,: comma  
,

--: dash  
--

.: sentence terminator  
. ! ?

:: colon or ellipsis  
: ; ...

CC: conjunction, coordinating  
& 'n and both but either et for less minus neither nor or plus so  
therefore times v. versus vs. whether yet

CD: numeral, cardinal  
mid-1890 nine-thirty forty-two one-tenth ten million 0.5 one forty-  
seven 1987 twenty '79 zero two 78-degrees eighty-four IX '60s .025  
fifteen 271,124 dozen quintillion DM2,000 ...

DT: determiner  
all an another any both del each either every half la many much nary  
neither no some such that the them these this those

EX: existential there  
there

FW: foreign word  
gemeinschaft hund ich jeux habeas Haementeria Herr K'ang-si vous  
lutihaw alai je jour objets salutaris fille quibusdam pas trop Monte  
terram fiche oui corporis ...

IN: preposition or conjunction, subordinating  
astride among upon whether out inside pro despite on by throughout  
below within for towards near behind atop around if like until below  
next into if beside ...

JJ: adjective or numeral, ordinal  
third ill-mannered pre-war regrettable oiled calamitous first separable  
ectoplasmic battery-powered participatory fourth still-to-be-named  
multilingual multi-disciplinary ...

JJR: adjective, comparative  
bleaker braver breezier briefer brighter brisker broader bumper busier  
calmer cheaper choosier cleaner clearer closer colder commoner costlier  
cozier creamier crunchier cuter ...

JJS: adjective, superlative  
calmest cheapest choicest classiest cleanest clearest closest commonest  
corniest costliest crassest creepiest crudest cutest darkest deadliest  
dearest deepest densest dinkiest ...

LS: list item marker  
A A. B B. C C. D E F First G H I J K One SP-44001 SP-44002 SP-44005  
SP-44007 Second Third Three Two \* a b c d first five four one six three  
two

MD: modal auxiliary  
can cannot could couldn't dare may might must need ought shall should

shouldn't will would

NN: noun, common, singular or mass  
common-carrier cabbage knuckle-duster Casino afghan shed thermostat  
investment slide humour falloff slick wind hyena override subhumanity  
machinist ...

NNP: noun, proper, singular  
Motown Venneboerger Czestochwa Ranzer Conchita Trumplane Christos  
Oceanside Escobar Kreisler Sawyer Cougar Yvette Ervin ODI Darryl CTCA  
Shannon A.K.C. Meltex Liverpool ...

NNPS: noun, proper, plural  
Americans Americas Amharas Amityvilles Amusements Anarcho-Syndicalists  
Andalusians Andes Andruses Angels Animals Anthony Antilles Antiques  
Apache Apaches Apocrypha ...

NNS: noun, common, plural  
undergraduates scotches bric-a-brac products bodyguards facets coasts  
divestitures storehouses designs clubs fragrances averages  
subjectivists apprehensions muses factory-jobs ...

PDT: pre-determiner  
all both half many quite such sure this

POS: genitive marker  
's

PRP: pronoun, personal  
hers herself him himself hisself it itself me myself one oneself ours  
ourselves ownself self she thee theirs them themselves they thou thy us

PRP\$: pronoun, possessive  
her his mine my our ours their thy your

RB: adverb  
occasionally unabatingly maddeningly adventurously professedly  
stirringly prominently technologically magisterially predominately  
swiftly fiscally pitilessly ...

RBR: adverb, comparative  
further gloomier grander graver greater grimmer harder harsher  
healthier heavier higher however larger later leaner lengthier less-  
perfectly lesser lonelier longer louder lower more ...

RBS: adverb, superlative  
best biggest bluntest earliest farthest first furthest hardest  
heartiest highest largest least less most nearest second tightest worst

RP: particle  
aboard about across along apart around aside at away back before behind  
by crop down ever fast for forth from go high i.e. in into just later  
low more off on open out over per pie raising start teeth that through  
under unto up up-pp upon whole with you

SYM: symbol  
% & ' ' ' ' . ) ) . \* + , . < = > @ A[fj] U.S U.S.S.R \* \*\* \*\*\*

T0: "to" as preposition or infinitive marker  
to

UH: interjection  
Goodbye Goody Gosh Wow Jeepers Jee-sus Hubba Hey Kee-reist Oops amen  
huh howdy uh dammit whammo shucks heck anyways whodunnit honey golly  
man baby diddle hush sonuvabitch ...

VB: verb, base form  
ask assemble assess assign assume atone attention avoid bake balkanize  
bank begin behold believe bend benefit bevel beware bless boil bomb  
boost brace break bring broil brush build ...

VBD: verb, past tense  
dipped pleaded swiped regummed soaked tidied convened halted registered  
cushioned exacted snubbed strode aimed adopted belied figgered  
speculated wore appreciated contemplated ...

VBG: verb, present participle or gerund  
telegraphing stirring focusing angering judging stalling lactating  
hankerin' alleging veering capping approaching traveling besieging  
encrypting interrupting erasing wincing ...

VBN: verb, past participle  
multihulled dilapidated aerosolized chaired languished panelized used  
experimented flourished imitated reunified factored condensed sheared  
unsettled primed dubbed desired ...

VBP: verb, present tense, not 3rd person singular  
predominate wrap resort sue twist spill cure lengthen brush terminate  
appear tend stray glisten obtain comprise detest tease attract  
emphasize mold postpone sever return wag ...

VBZ: verb, present tense, 3rd person singular  
bases reconstructs marks mixes displeases seals carps weaves snatches  
slumps stretches authorizes smolders pictures emerges stockpiles  
seduces fizzes uses bolsters slaps speaks pleads ...

WDT: WH-determiner  
that what whatever which whichever

WP: WH-pronoun  
that what whatever whatsoever which who whom whosoever

WP\$: WH-pronoun, possessive  
whose

WRB: Wh-adverb  
how however whence whenever where whereby wherever wherein whereof why

``: opening quotation mark  
````

```
In [25]: table = PrettyTable(field_names=['Words', 'POS'])
for word, pos in zip(words, tagged_words):
    table.add_row([word, pos[1]])
print(table)
```

| Words       | POS   |
|-------------|-------|
| The         | DT    |
| scientists  | NNS   |
| discover    | VBP   |
| new         | JJ    |
| species     | NNS   |
| every       | DT    |
| year        | NN    |
| ,           | ,     |
| Last        | JJ    |
| year        | NN    |
| ,           | ,     |
| they        | PRP   |
| discovered  | VBD   |
| an          | DT    |
| ancient     | JJ    |
| artifact    | NN    |
| .           | .     |
| they        | PRP   |
| are         | VBP   |
| discovering | VBG   |
| new         | JJ    |
| techniques  | NNS   |
| with        | IN    |
| their       | PRP\$ |
| recent      | JJ    |
| discovery   | NN    |

## Lemmatizing

```
In [26]: from nltk.stem import WordNetLemmatizer
```

```
In [27]: nltk.download('wordnet')
```

```
[nltk_data] Downloading package wordnet to
[nltk_data]     C:\Users\Uditya\AppData\Roaming\nltk_data...
[nltk_data]     Package wordnet is already up-to-date!
```

```
Out[27]: True
```

```
In [28]: lemmetizer = WordNetLemmatizer()
```

```
In [29]: words = word_tokenize(text)
```

```
In [30]: lemma = [lemmetizer.lemmatize(word) for word in words]
```

```
In [31]: table = PrettyTable(field_names=['word', 'stemmed word', 'lemma word'])
```

```

for word, stm, lm in zip(words, stemmed_words, lemma):
    table.add_row([word, stm, lm])

print(table)

```

| word        | stemmed word | lemma word  |
|-------------|--------------|-------------|
| The         | the          | The         |
| scientists  | scientist    | scientist   |
| discover    | discov       | discover    |
| new         | new          | new         |
| species     | speci        | specie      |
| every       | everi        | every       |
| year        | year         | year        |
| ,           | ,            | ,           |
| Last        | last         | Last        |
| year        | year         | year        |
| ,           | ,            | ,           |
| they        | they         | they        |
| discovered  | discov       | discovered  |
| an          | an           | an          |
| ancient     | ancient      | ancient     |
| artifact    | artifact     | artifact    |
| .           | .            | .           |
| they        | they         | they        |
| are         | are          | are         |
| discovering | discov       | discovering |
| new         | new          | new         |
| techniques  | techniqu     | technique   |
| with        | with         | with        |
| their       | their        | their       |
| recent      | recent       | recent      |
| discovery   | discoveri    | discovery   |

## Chunking

```
In [32]: text = "Docker and Docker Compose have become essential tools for developers a
```

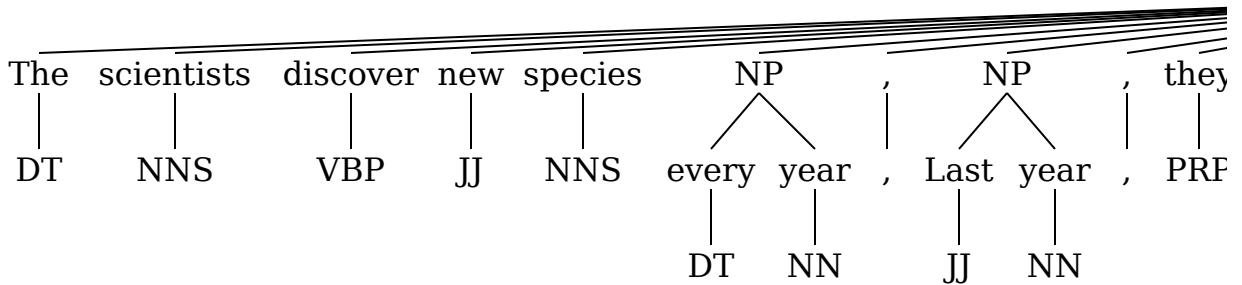
```
In [33]: from nltk.chunk import RegexpParser
grammar = "NP: {<DT>?<JJ>*<NN>}"
```

```
In [34]: chunk_parser = RegexpParser(grammar)
chunks = chunk_parser.parse(tagged_words)
```

```
In [35]: # !pip install svglng
```

```
In [36]: chunks
```

Out[36]:



In [37]: `print(chunks)`

```
(S
  The/DT
  scientists/NNS
  discover/VBP
  new/JJ
  species/NNS
  (NP every/DT year/NN)
  ,/
  (NP Last/JJ year/NN)
  ,/
  they/PRP
  discovered/VBD
  (NP an/DT ancient/JJ artifact/NN)
  ./
  they/PRP
  are/VBP
  discovering/VBG
  new/JJ
  techniques/NNS
  with/IN
  their/PRP$
  (NP recent/JJ discovery/NN))
```

## Named Entity Recognition(NER)

In [38]: `from nltk.chunk import ne_chunk`

In [39]: `nltk.download('words')`  
`nltk.download('maxent_ne_chunker_tab')`

```
[nltk_data] Downloading package words to
[nltk_data]     C:\Users\Uditya\AppData\Roaming\nltk_data...
[nltk_data] Package words is already up-to-date!
[nltk_data] Downloading package maxent_ne_chunker_tab to
[nltk_data]     C:\Users\Uditya\AppData\Roaming\nltk_data...
[nltk_data] Package maxent_ne_chunker_tab is already up-to-date!
```

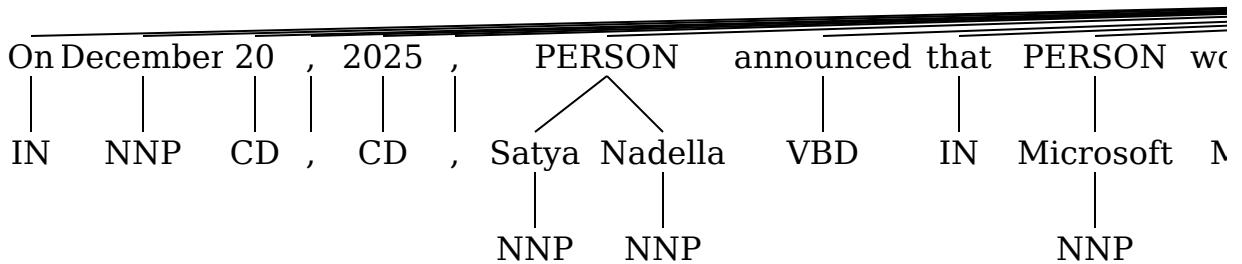
Out[39]: True

```
In [40]: text = """  
On December 20, 2025, Satya Nadella announced that Microsoft would invest $5 b  
"""  
  
words = word_tokenize(text)  
  
tagged_words = pos_tag(words)
```

```
In [41]: ner_tree = ne_chunk(tagged_words)
```

```
In [42]: ner_tree
```

Out[42]:



```
In [43]: for ner in ner_tree:  
        if hasattr(ner, 'label'):  
            print(''.join(c[0] for c in ner), ":", ner.label())
```

Satya Nadella : PERSON  
Microsoft : PERSON  
London : GPE  
Kings Cross : PERSON  
Google : ORGANIZATION  
Mountain View : GPE  
California : GPE