

ANLP Project

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Problem to solve

Given a word in a text detect if it is negate:

word: gallops

text: No murmurs, GALLOPS, or rubs.

Or not:

word: vomiting

text: The patient was admitted on **DATE[Sep 25 2007], complaining of nausea and VOMITING.

Using negEx as a tagger

- **[PREN]** - Prenegation rule tag
- **[POST]** - Postnegation rule tag
- **[PREP]** - Pre possible negation tag
- **[POSP]** - Post possible negation tag
- **[PSEU]** - Pseudo negation tag
- **[CONJ]** - Conjunction tag
- **[PHRASE]** - Term is recognized from the term list
- **[NEGATED]** - Term was recognized from term list, and it was found being negated

Using negEx as a tagger

getNegTaggedSentence:

- **sentence1** = '[**PREN**]no[**PREN**] murmurs, [**NEGATED**]GALLOPS [**NEGATED**], or rubs.'
- **sentence2** = 'The patient was admitted on **DATE[Sep 25 2007], complaining of nausea and [**PHRASE**]VOMITING[**PHRASE**].'
- **sentence3** = 'His [**PHRASE**]NAUSEA[**PHRASE**] and vomiting [**PREN**]resolved[**PREN**] .'

reTag

- **sentence1** = '**PREN** murmurs, **NEGATED**, or rubs.'
- **sentence2** = 'The patient was admitted on ****DATE**[Sep 25 2007], complaining of nausea and **PHRASE**.'
- **sentence3** = 'His **PHRASE** and vomiting **PREN** .'

Replace **NEGATED** by **PHRASE**:

- **sentence1** = '**PREN** murmurs, **PHRASE**, or rubs.'
- **sentence2** = 'The patient was admitted on ****DATE**[Sep 25 2007], complaining of nausea and **PHRASE**.'
- **sentence3** = 'His **PHRASE** and vomiting **PREN** .'

reTag

Use additional may be useful tags:

- **POINT:** .
- **COMMA:** ,
- **OR:** or
- **AND:** and

reTag

- **sentence1** = 'PREN murmurs **COMMA PHRASE COMMA OR**
rubs **POINT**'
- **sentence2** = 'The patient was admitted on **DATE[Sep 25 2007]
COMMA complaining of nausea **AND PHRASE POINT**'
- **sentence3** = 'His **PHRASE AND** vomiting **PREN POINT**'

reTag

Replace all non tagged words by **WORDS**

- **sentence1 = 'PREN WORDS COMMA PHRASE COMMA OR WORDS POINT'**
- **sentence2 = 'WORDS WORDS WORDS WORDS WORDS WORDS WORDS COMMA WORDS WORDS WORDS AND PHRASE POINT'**
- **sentence3 = 'WORDS PHRASE AND WORDS PREN POINT'**

Remove consecutive **WORDS**

- **sentence1 = 'PREN WORDS COMMA PHRASE COMMA OR WORDS POINT'**
- **sentence2 = 'WORDS COMMA WORDS AND PHRASE POINT'**
- **sentence3 = 'WORDS PHRASE AND WORDS PREN POINT'**

And finally split the sentence in pre PHRASE and post PHRASE

- **sentence1**
 - pre: **COMMA WORDS PREN**
 - post: **COMMA OR WORDS POINT**
- **sentence2**
 - pre: **AND WORDS COMMA WORDS**
 - post: **POINT**
- **sentence3**
 - pre: **WORDS**
 - post: **AND WORDS PREN POINT**

Features

- **Feature1:** The previous and next tag to the PHRASE
- **Feature2:** The two previous and next tags to the PHRASE
- **Feature3:** The three previous and next tags to the PHRASE
- **Feature4:** If there was a PREN tag before PHRASE and there wasn't a POINT between them.

Features

sentence1

- **pre:** COMMA WORDS PREN
- **post:** COMMA OR WORDS POINT

Feature1:

- **pre:** COMMA
- **post:** COMMA

Feature2:

- **pre:** COMMA WORDS
- **post:** COMMA OR

Feature3:

- **pre:** COMMA WORDS PREN
- **post:** COMMA OR WORDS

Feature4: True

Naive Bayes

Then just count words and be happy :)

$$\begin{aligned} p(C, F_1, \dots, F_n) &= p(C) p(F_1|C) p(F_2|C) p(F_3|C) \dots \\ &= p(C) \prod_{i=1}^n p(F_i|C). \end{aligned}$$

Testing performance

		Condition (as determined by "Gold standard")		
		Condition positive	Condition negative	
Test outcome	Test outcome positive	True positive	False positive (Type I error)	Precision = $\frac{\Sigma \text{ True positive}}{\Sigma \text{ Test outcome positive}}$
	Test outcome negative	False negative (Type II error)	True negative	Negative predictive value = $\frac{\Sigma \text{ True negative}}{\Sigma \text{ Test outcome negative}}$
		Sensitivity = $\frac{\Sigma \text{ True positive}}{\Sigma \text{ Condition positive}}$	Specificity = $\frac{\Sigma \text{ True negative}}{\Sigma \text{ Condition negative}}$	Accuracy

Testing performance

Training set (2115):

- Results:
 - Correct: 2071
 - Negative Correct: 426
 - Negative Incorrect: 20
 - Positive Correct: 1645
 - Positive Incorrect: 24
- NegEx results:
 - Correct: 2056
 - Negative Correct: 406
 - Negative Incorrect: 40
 - Positive Correct: 1650
 - Positive Incorrect: 19

Testing performance

Training set

- Results:
 - sensitivity: $1645/(1645+20) = 0.9879$
 - specificity: $426/(426+24) = 0.9466$
 - precision(PPV): $1645/(1645+24) = 0.9856$
 - NPV: $426/(426+20) = 0.9551$
 - accuracy: $2071/2115 = 0.9791$
- NegEx results:
 - sensitivity: $1650/(1650+40) = 0.9763$
 - specificity: $406/(406+19) = 0.9552$
 - precision(PPV): $1650/(1650+19) = 0.9886$
 - NPV: $406/(406+40) = 0.9103$
 - accuracy: $2056/2115 = 0.9721$

Testing performance

Testing set (235)

- Results:
 - sensitivity: $188/(188+0) = 1$
 - specificity: $44/(44+3) = 0.9361$
 - precision(PPV): $188/(188+3) = 0.9842$
 - NPV: $44/(44+0) = 1$
 - accuracy: $232/235 = 0.9872$
- NegEx results:
 - sensitivity: $187/(187+2) = 0.9894$
 - specificity: $42/(42+4) = 0.913$
 - precision(PPV): $187/(187+4) = 0.979$
 - NPV: $42/(42+2) = 0.9545$
 - accuracy: $229/235 = 0.9744$

Improvements

- Add more features
- Add more useful tags