

TextBlob情感分析调研

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主要内容

- Textblob简介
- 情感分析接口
- 情感分析算法流程
- 实验
- 结论

TextBlob

- TextBlob is a Python (2 and 3) library for processing textual data. It provides a simple API for diving into common natural language processing (NLP) tasks such as **part-of-speech tagging, noun phrase extraction, sentiment analysis, classification, translation, and more.**

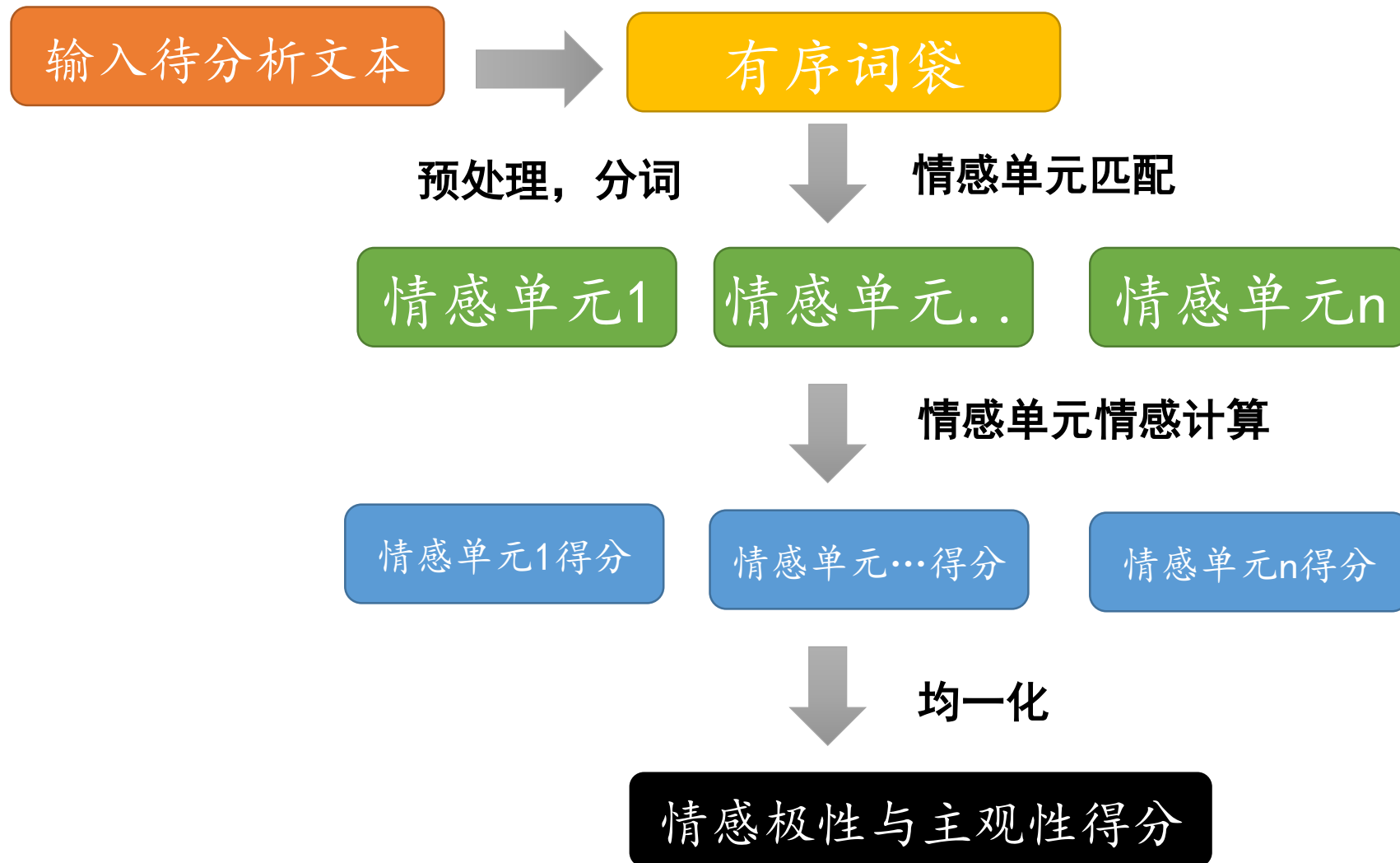
情感分析接口

- 引入: `from textblob import TextBlob`
- 使用:
 - `>> S = ("not a very great calculation")`
 - `>> TextBlob(S).sentiment`
 - `>> Sentiment(polarity=-0.3076923076923077, subjectivity=0.5769230769230769)`
- 说明:
 - polarity: negative vs. positive (-1.0 => +1.0) : 情感极性
 - subjectivity: objective vs. subjective (+0.0 => +1.0): 情感主观性

算法步骤

- step1: given sentence S
- step2: SentenceTokenize
- step3: remove single word, where $\text{len}(\text{word})=1$
- step4: search sentiment-chunk, [sentiword],[modifyword, sentiword], [denyword, sentiword], [modifyword, denyword, sentiword]
- step5: average polarity, subjectivity in sentiment-chunk
- step6: finished

算法流程



预处理与分词

- 去除单字词
- 以空格为分隔符
- 标点符号为分隔符
 - 普通标点符号
 - 情绪符号:

```
("love" , +1.00): set(("<3", "❤️")),
("grin" , +1.00): set((">:D", ":-D", ":D", "=-D", "=D", "X-D", "x-D", "XD", "xD", "8-D")),
("taunt", +0.75): set((">:P", ":-P", ":P", ":-p", ":p", ":-b", ":b", ":c)", ":o)", ":^)")),
("smile", +0.50): set((">:)", ":-)", ":)", "=)", "=]", ":]", ":}", ":>", ":3", "8)", "8-)")),
("wink", +0.25): set((">:]", ":-)", ":)", ";-]", ";]", ";D", ";^)", "*-)", "*))",
("gasp", +0.05): set((">:o", ":-O", ":O", ":o", ":-o", "o_O", "o.O", "° O°", "° o°")),
("worry", -0.25): set((">:/", ":-/", ":/", ":\\", ">:\\", ":-.", ":-s", ":s", ":S", ":-S", ">.>")),
("frown", -0.75): set((">:[", ":-(", ":(", "=(", ":-[", ":[", ":{", ":-<", ":c", ":-c", "=/")),
("cry" , -1.00): set((":'(", ":'('", ":'('))
```

词形转换: don't -> do n't

小写统一化: Do -> do

简写处理: abbr.

... ..

情感单元匹配

- 约定：
 - m->modifyword: 程度副词, very
 - n->denywords: 否定副词, not, no, never
 - S->sentiwords: 情感词, happy, horrible...
- 匹配规则：
 - Pattern1: “n?m*S”
 - Pattern2: “n?m*S[^S]*!\$”

情感单元匹配举例

- "I am not no happy today"
 - ['no', 'happy']
- "this is never very good day but very much good in the world"
 - [['never', 'very', 'good'], ['very', 'much', 'good']]
- "this is never very very good day but very much good in the world"
 - [['never', 'very', 'very', 'good'], ['very', 'much', 'good']]
- "this is not a good great day"
 - [['not', 'good'], ['great']]
- "I am not no happy today"
 - [['no', 'happy']]

情感词

- 情感词表:

- 文件名: Sentiment-en.xml
- Author: Tom de smedt ,walter Daelemans
- 2918个语义synset词条
- 1528个唯一词

- 词条:

- `<word form="great" cornetto_synset_id="n_a-525317" wordnet_id="a-01123879" pos="JJ" sense="very good" polarity="1.0" subjectivity="1.0" intensity="1.0" confidence="0.9" />`

- 释义:

- polarity: negative vs. positive (-1.0 => +1.0) --情感极性
- subjectivity: objective vs. subjective (+0.0 => +1.0) --情感主观性
- intensity: modifies next word? (x0.5 => x2.0) -- 情感强度 Sentiment-en.xml

情感单元情感计算

- 单个情感词情感计算
- 否定词+情感词
- 修饰词+情感词
- 否定词+修饰词+情感词

单个情感词

- 单个情感词的语义信息，一词多义，one to many:
 - word polarity subjectivity intensity
 - great 1.0 1.0 1.0
 - great 1.0 1.0 1.0
 - great 0.4 0.2 1.0
 - great 0.8 0.8 1.0
- 单个情感词的情感得分
 - 一个词语下多个synset情感极性、主观性进行平均化
 - TextBlob("great").sentiment
 - Sentiment(polarity=0.8, subjectivity=0.75)

否定词+情感词

- `TextBlob("great").sentiment`

- polarity=0.8
- subjectivity=0.75

word	polarity	subjectivity	intensity
great	1.0	1.0	1.0
great	1.0	1.0	1.0
great	0.4	0.2	1.0
great	0.8	0.8	1.0

$(\text{Sigma}(\text{polarity})/n,$
 $\text{Sigma}(\text{subjectivity})/n$

- `TextBlob("not great").sentiment`

- polarity=-0.4
- subjectivity=0.75

polarity*-0.5, subjectivity *1

修饰词+情感词

- `TextBlob("great").sentiment`

- `polarity=0.8`
- `subjectivity=0.75`

word polarity subjectivity intensity

very 0.2 0.3 1.3

- `TextBlob("very great").sentiment`

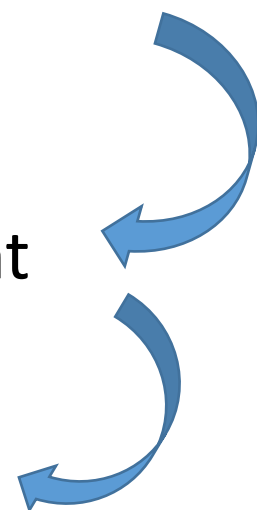
- `polarity=1.0`
- `subjectivity=0.975`

Polarity: $\min(1.0, 0.8 * 1.3)$

Subjectivity: $\min(1.0, 0.75 * 1.3)$

- `TextBlob("very very great").sentiment`

- `polarity=1.0`
- `subjectivity=0.975`



否定词+修饰词+情感词

- `TextBlob("great").sentiment`

- `polarity=0.8`
- `subjectivity=0.75`

word polarity subjectivity intensity
very 0.2 0.3 1.3

- `TextBlob("not very great").sentiment`

- `polarity=-0.3076923076923077`
- `subjectivity=0.5769230769230769`



1、极性：否定对正向程度副词形成反比例逆转

2：主观性：否定只逆转程度，不逆转值

$$\text{Polarity} = -0.5 * 1/1.3 * 0.8 \approx -0.31$$

$$\text{Subjectivity} = 1/1.3 * 0.75 \approx 0.58$$

情感均一化

- 对所有chunk进行得分平均化：
 - 给定每个chunk的权重weight, 默认都是1, 即每个都同等重要
 - $\text{polarity} = \text{avg}([(w, p) \text{ for } w, p, s, x \text{ in chunks}], \text{weight}),$
 - $\text{subjectivity} = \text{avg}([(w, s) \text{ for } w, p, s, x \text{ in chunks}], \text{weight}))$

实验1-无情感词

- Chunks: ([words], polarity, subjectivity, label:None/profanity])
- s = "i don't want to share with you"
- Chunks:
 - []
- Result:
 - polarity=0.0,
 - subjectivity=0.0

实验2-只包含情感词

- s = "hello this is my **favorite** food and i don't want to share with you"
- Chunks:
 - `[(['favorite'], 0.5, 1.0, None)]`
- Result:
 - polarity=0.5
 - subjectivity=1.0

实验3-包含情感词与否定词

- s = "this is not a good great day"
- Chunks:
 - ([['not', 'good'], -0.35, 0.60000000000000000001, None),
 - ([['great'], 0.8, 0.75, None)]
- Result:
 - polarity=0.225000000000000000003
 - subjectivity=0.675

实验4-包含情感词与否定词

- s = "this is not a good and not great day"
- Chunks:
 - ([['not', 'good'], -0.35, 0.600000000000000001, None)
 - ([['not', 'great'], -0.4, 0.75, None)]
- Result:
 - polarity=-0.375
 - subjectivity=0.675

实验5-包含情感词、否定词、单个程度词

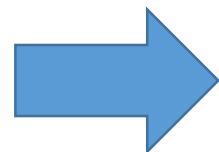
- s = 'this is not a good but never very a bad day'
- Chunks:
 - [(['not', 'good'], -0.35, 0.60000000000000000001, None)
 - ([('never', 'very', 'bad'], 0.26923076923076916, 0.5128205128205128, None)]
- Result:
 - polarity=-0.04038461538461541,
 - subjectivity=0.5564102564102564

实验6-包含情感词、否定词、多个程度词

- s = 'this is never very good day but very much good in the world'
- Chunks:
 - ([['never', 'very', 'good'], -0.26923076923076916, 0.46153846153846156, None)
 - ([['very', 'much', 'good'], 0.7, 0.60000000000000000001, None)]
- Result:
 - polarity=0.2153846153846154
 - subjectivity=0.5307692307692309

实验7-包含情感词、多个否定词

- s = 'i am not no happy today'
- Chunks:
 - [(['no', 'happy'], -0.4, 1.0, None)]
- Result:
 - polarity=-0.4
 - subjectivity=1.0



没有解决双重否定的类型.

总结

- TextBlob中的情感分析是基于规则与语义词表相结合的方法
- 算法三要素：
 - 否定词表，提供逆转信息
 - 程度词表，提供强度修饰信息，修正极性与主观性
 - 情感词表，提供词语极性信息，主观性信息，强度信息，wordnet
- 局限：
 - 实际为ordered Bag of words，只考虑相近窗口修饰关系，没有考虑句法信息
 - 对双重否定类型的句子失效
 - 对情感单元的极性与主观性得分进行平均化的算法，可以改进
 - 不支持中文
- TextBlob机器学习方法：
 - 基于Bayes的情感分类：
 - 接口textblob.classifier(), 只返回正正负信息
 - 训练语料：电影评论数据集，neg, pos
- 中文文本主观性评判
 - 就目前调研结果来看，还没有主观性语义知识库可以使用
 - 主观性的界定问题，尤其对新闻文本的主观性如何量化？

参考

- https://planspace.org/20150607-textblob_sentiment/
- <http://textblob.readthedocs.io/en/dev/>