

# Sentiment Analysis

Predict sentiment from text.

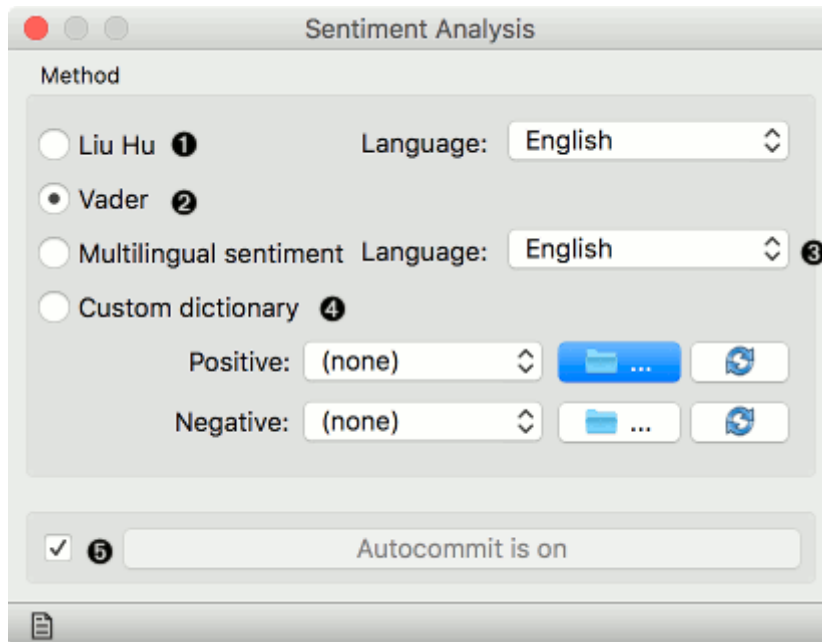
## Inputs

- Corpus: A collection of documents.

## Outputs

- Corpus: A corpus with information on the sentiment of each document.

**Sentiment Analysis** predicts sentiment for each document in a corpus. It uses Liu & Hu and Vader sentiment modules from **NLTK** and multilingual sentiment lexicons from the **Data Science Lab**. All of them are lexicon-based. For Liu & Hu, you can choose English or Slovenian version. Vader works only on English. Multilingual sentiment supports several languages, which are listed at the bottom of this page.



1. *Liu Hu*: lexicon-based sentiment analysis (supports English and Slovenian). The final score is the difference between the sum of positive and sum of negative words, normalized by the length of the document and multiplied by a 100. The final score reflects the percentage of sentiment difference in the document.
2. *Vader*: lexicon- and rule-based sentiment analysis
3. *Multilingual sentiment*: lexicon-based sentiment analysis for several languages

4. *Custom dictionary*: add you own positive and negative sentiment dictionaries. Accepted source type is .txt file with each word in its own line. The final score is computed in the same way as Liu Hu.
5. If *Auto commit is on*, sentiment-tagged corpus is communicated automatically. Alternatively press *Commit*.

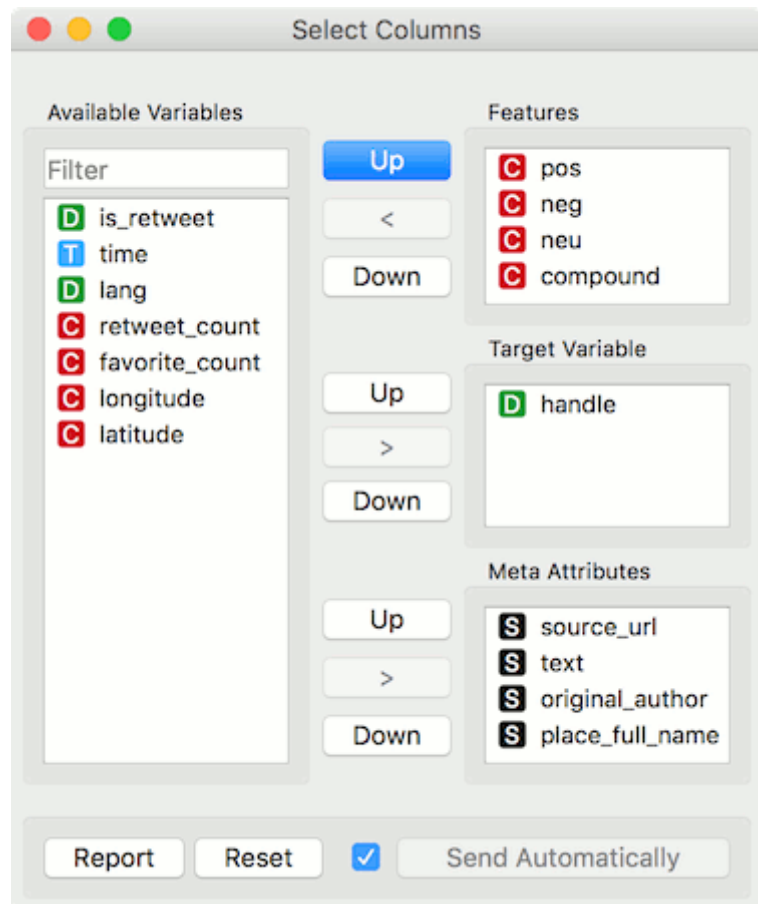
## Example

*Sentiment Analysis* can be used for constructing additional features with sentiment prediction from corpus. First, we load *Election-2016-tweets.tab* in **Corpus**. Then we connect **Corpus** to **Sentiment Analysis**. The widget will append 4 new features for Vader method: positive score, negative score, neutral score and compound (combined score).

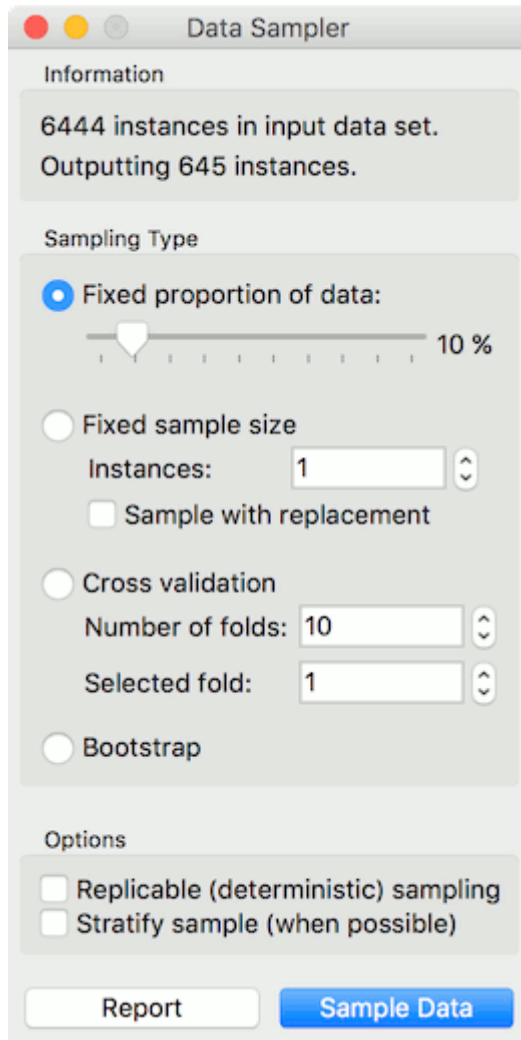
We can observe new features in a **Data Table**, where we sorted the *compound* by score. Compound represents the total sentiment of a tweet, where -1 is the most negative and 1 the most positive.

Data Table						
Info						
6444 instances						
11 features (18.1% missing values)						
Discrete class with 2 values (no missing values)						
4 meta attributes (46.4% missing values)						
Variables						
<input checked="" type="checkbox"/> Show variable labels (if present)						
<input type="checkbox"/> Visualize continuous values						
<input checked="" type="checkbox"/> Color by instance classes						
Selection						
<input checked="" type="checkbox"/> Select full rows						
Restore Original Order						
Report						
<input checked="" type="checkbox"/> Send Automatically						
	handle	text True True	pos	neg	neu	compound
1	HillaryClinton	The questio...	0.139	0.000	0.861	0.440
2	HillaryClinton	Last night, D...	0.000	0.000	1.000	0.000
3	HillaryClinton	Couldn't be ...	0.165	0.102	0.733	0.185
4	HillaryClinton	If we stand t...	0.128	0.101	0.771	0.138
5	HillaryClinton	Both candid...	0.000	0.278	0.722	-0.660
6	realDonaldTrump	Join me for a...	0.142	0.000	0.858	0.359
7	HillaryClinton	This election...	0.204	0.000	0.796	0.477
8	HillaryClinton	When Donal...	0.000	0.000	1.000	0.000
9	realDonaldTrump	Once again, ...	0.128	0.000	0.872	0.359
10	HillaryClinton	3) Has Trum...	0.000	0.000	1.000	0.000
11	HillaryClinton	The election ...	0.000	0.000	1.000	0.000
12	realDonaldTrump	On National ...	0.150	0.000	0.850	0.318
13	realDonaldTrump	Hillary Clinto...	0.000	0.000	1.000	0.000
14	realDonaldTrump	CNBC, Time ...	0.188	0.000	0.812	0.572
15	HillaryClinton	Donald Trum...	0.000	0.126	0.874	-0.382
16	realDonaldTrump	Great aftern...	0.425	0.000	0.575	0.862
17	realDonaldTrump	In the last 2...	0.114	0.000	0.886	0.474

Now let us visualize the data. We have some features we are currently not interested in, so we will remove them with **Select Columns**.



Then we will make our corpus a little smaller, so it will be easier to visualize. Pass the data to **Data Sampler** and retain a random 10% of the tweets.



The screenshot shows the 'Data Sampler' widget in the Orange Data Mining software. The window has a title bar with standard macOS window controls (red, yellow, and grey buttons). The main content area is divided into three sections: 'Information', 'Sampling Type', and 'Options'. The 'Information' section displays '6444 instances in input data set.' and 'Outputting 645 instances.' The 'Sampling Type' section contains four radio buttons: 'Fixed proportion of data:' (selected), 'Fixed sample size', 'Cross validation', and 'Bootstrap'. The 'Fixed proportion of data:' option has a slider set to 10%. The 'Fixed sample size' option has a text box for 'Instances:' set to 1 and a checkbox for 'Sample with replacement'. The 'Cross validation' option has text boxes for 'Number of folds:' set to 10 and 'Selected fold:' set to 1. The 'Options' section has two checkboxes: 'Replicable (deterministic) sampling' and 'Stratify sample (when possible)', both of which are unchecked. At the bottom of the widget are two buttons: 'Report' and 'Sample Data'.

Information

6444 instances in input data set.  
Outputting 645 instances.

Sampling Type

☒ Fixed proportion of data:  
10 %

☐ Fixed sample size  
Instances: 1  
☐ Sample with replacement

☐ Cross validation  
Number of folds: 10  
Selected fold: 1

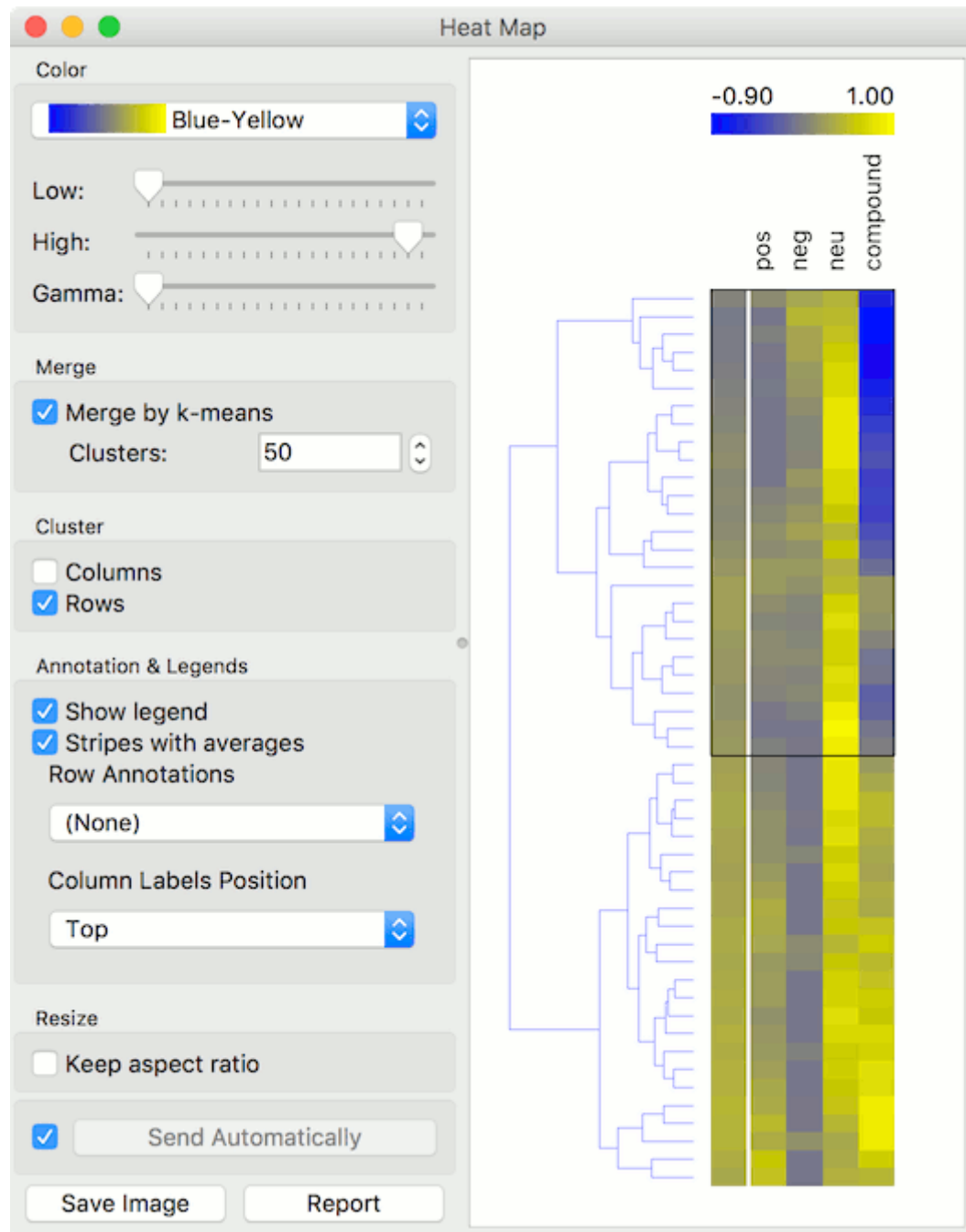
☐ Bootstrap

Options

☐ Replicable (deterministic) sampling  
☐ Stratify sample (when possible)

Report Sample Data

Now pass the filtered corpus to **Heat Map**. Use *Merge by k-means* to merge tweets with the same polarity into one line. Then use *Cluster by rows* to create a clustered visualization where similar tweets are grouped together. Click on a cluster to select a group of tweets - we selected the negative cluster.



To observe the selected subset, pass the tweets to [Corpus Viewer](#).

Corpus Viewer

Info

Documents: 375  
Preprocessed: False  
 Tokens: n/a  
 Types: n/a  
 POS tagged: False  
 N-grams range: 1-1  
 Matching: 375/375

Search features

pos  
neg  
neu  
compound  
handle

Display features

handle  
source\_url  
text  
original\_author  
place\_full\_name

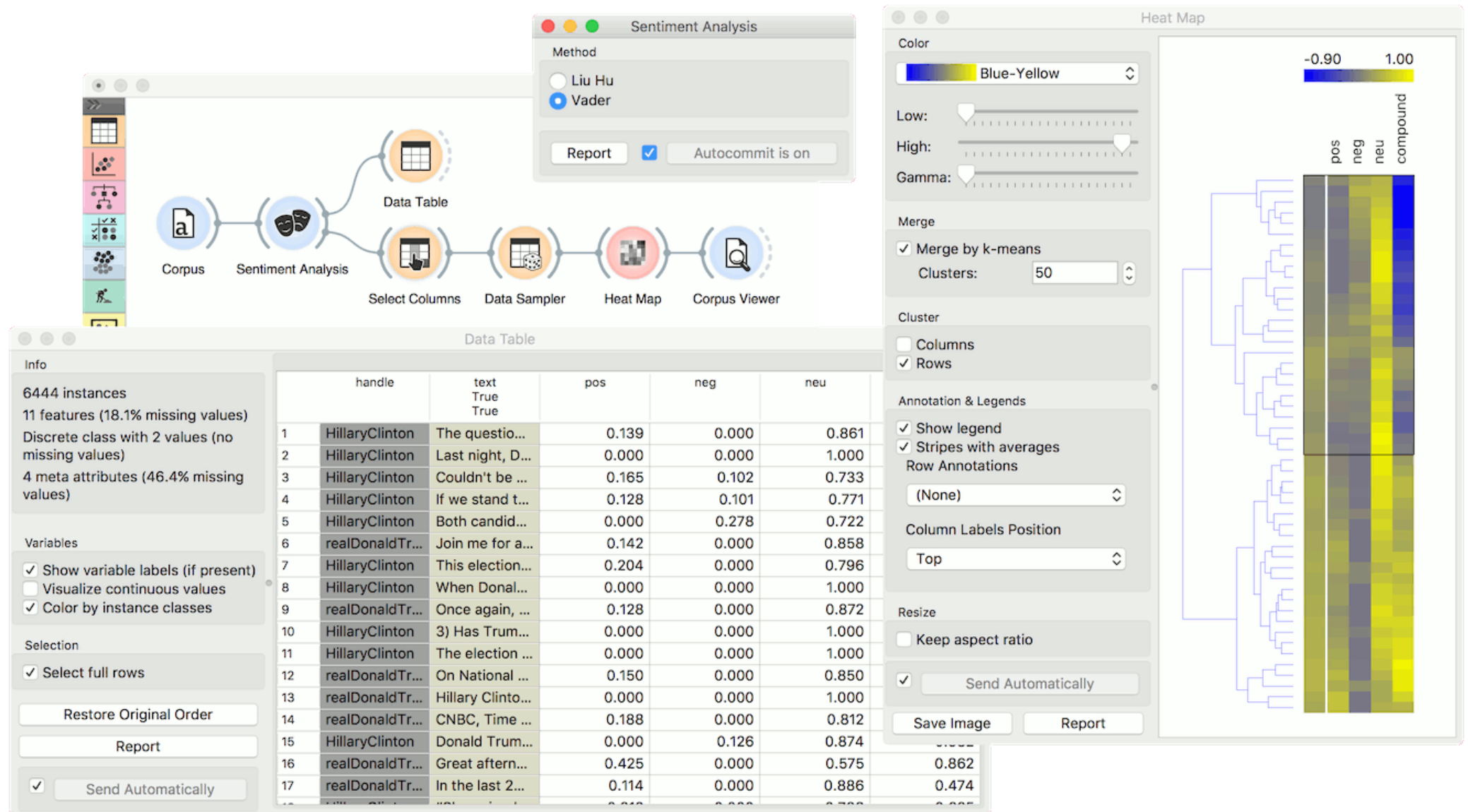
☐ Show Tokens & Tags

☒ Auto send is on

RegExp Filter:

1	A message of ...	compound: -0.710 text: A message of condolences and support regarding the terrorist attacks in Tel Aviv: <a href="https://t.co/iulXLEANei">https://t.co/iulXLEANei</a>
2	Let's ask ours...	
3	Wonderful @p...	compound: -0.572 text: Let's ask ourselves, "What can I do to stop violence and promote justice?" <a href="https://t.co/l2nRKcuxNs">https://t.co/l2nRKcuxNs</a>
4	Our diversity i...	
5	Little Marco R...	
6	Your @GOP pr...	compound: -0.611 text: Wonderful @pastormarkburns was attacked viciously and unfairly on @MSNBC by crazy @morningmika on low ratings @Morning_Joe. Apologize!
7	.@realDonaldTrump...	
8	You're wrong, ...	
9	This week, Tru...	compound: -0.599 text: Our diversity isn't a liability in the fight against terrorism. It's an asset. It makes us stronger. <a href="https://t.co/0cTpmfvA3c">https://t.co/0cTpmfvA3c</a>
10	Hillary Clinton ...	
11	Leaked e-mail...	compound: -0.887 text: Little Marco Rubio gave amnesty to criminal aliens guilty of "sex offenses." DISGRACE! <a href="https://t.co/mZwpynzslb">https://t.co/mZwpynzslb</a>
12	The NRA is ba...	
13	Kasich voted f...	compound: -0.932 text: Your @GOP presidential nominee responding to a terrorist attack with lies and conspiracy theories. <a href="https://t.co/TZJmXefmx4">https://t.co/TZJmXefmx4</a>
14	Gun violence a...	
15	Wow, the ridic...	
16	So many in the...	compound: -0.832 text: .@realDonaldTrump's "ideas" are really just a series of bizarre rants, personal feuds, and outright lies.
17	If @TedCruz d...	





## References

Hutto, C.J. and E. E. Gilbert (2014). VADER: A Parsimonious Rule-based Model for Sentiment Analysis of Social Media Text. Eighth International Conference on Weblogs and Social Media (ICWSM-14). Ann Arbor, MI, June 2014.

Hu, Mingqing and Bing Liu (2004). Mining opinion features in customer reviews. In Proceedings of AAAI Conference on Artificial Intelligence, vol. 4, pp. 755–760. [Available online.](#)

Kadunc, Klemen and Marko Robnik-Šikonja (2016). Analiza mnenj s pomočjo strojnega učenja in slovenskega leksikona sentimenta. Conference on Language Technologies & Digital Humanities, Ljubljana (in Slovene). [Available online](#).

## Multilingual Sentiment Languages

- Afrikaans
- Arabic
- Azerbaijani
- Belarusian
- Bosnian
- Bulgarian
- Catalan
- Chinese
- Chinese Characters
- Croatian
- Czech
- Danish
- Dutch
- English
- Estonian
- Farsi
- Finnish
- French
- Gaelic
- German
- Greek
- Hebrew
- Hindi
- Hungarian
- Indonesian
- Italian
- Japanese
- Korean
- Latin
- Latvian
- Lithuanian
- Macedonian
- Norwegian
- Norwegian Nynorsk



- Polish
- Portuguese
- Romanian
- Russian
- Serbian
- Slovak
- Slovene
- Spanish
- Swedish
- Turkish
- Ukrainian