The User Feedback on SENTIWORDNET

Andrea Esuli

Istituto di Scienza e Tecnologie dell'Informazione "A. Faedo" via G. Moruzzi, 1 - 56124 Pisa, Italy andrea.esuli@isti.cnr.it

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Abstract

With the release of SENTIWORDNET 3.0 the related Web interface has been restyled and improved in order to allow users to submit feedback on the SENTIWORDNET entries, in the form of the suggestion of alternative triplets of values for an entry. This paper reports on the release of the user feedback collected so far and on the plans for the future.

1 Introduction

SENTIWORDNET [1] is an automatically generated lexical resource that assigns to each sysnest of WORDNET [2] a triplet of positivity, negativity and objectivity scores.

SENTIWORDNET is a general (or global) lexicon, i.e., its scores are deemed to be of general application regardless of the specific domain of the text which contains the terms to which the scores are associated. The hypothesis on global applicability of scores to terms may not hold on all the possible uses of terms in any domain but, from a practical perspective, it should hold for a large part of the cases. In SENTIWORDNET this hypothesis holds stronger because the application of scores to each distinct sense of a term allows to discriminate a good number of otherwise sentiment-ambiguous cases, e.g., **blue** in the sense of the color or in the sense of the mood¹.

In its practical use SENTIWORDNET can be considered a resource that provides a basic, wide-coverage, sentiment knowledge into the application in which it is used. Domain-specific applications will then likely pair it with a domainspecific resource in order to improve the precision on domain-specific terms.

SENTIWORDNET is an automatically generated resource and, as for any other automatic labeling process based on machine learning, it contains errors, i.e., incorrect triplets of values associated to some synsets. With the release of SENTIWORDNET 3.0 the related Web interface² has been restyled and improved in order to allow users to submit feedback on the SENTIWORDNET entries, in the form of the suggestion of alternative triplets of values for an entry, as shown in Figures 1 and 2.

¹This also requires sense level disambiguation of text.

²http://swn.isti.cnr.it/

In the following we report on the collected feedback information and also on the future evolution of the feedback collection process.

2 Collecting the feedback

SentiWordNet	×	
← → C 🗋 swn.ist	i.cnr.it/search.php?q=pitiful @ 🖄 🍫 🔄 🔮	-0 0 ≡
📩 Sen	WordNet petho	
	ADJECTIVE	
	pitiful#1 pitiable#1 pathetic#2	00905181
	inspiring mixed contempt and pity; "their efforts were pathetic"; "pitiable lack of character"; "pitiful exhibition of cowardice"	
P: 0.333 O: 0 N: 0.667		Feedback!
	sorry#2 sad#3 pitiful#2 lamentable#1 distressing#2 deplorable#1	01126841
	bad; unfortunate; "my finances were in a deplorable state"; "a lamentable decision"; "her clothes were in sad shape"; "a sorry state of affairs"	
P: 0 O: 0 N: 1		Feedback!
	wretched#5 poor#1 pitiful#3 pitiable#2 piteous#1 pathetic#1 misfortunate#1 miserable#2 hapless#1	01050890
	deserving or inciting pity; "a hapless victim"; "miserable victims of war"; "the shabby room struck her as extraordinarily pathetic"- Galsworthy; "piteous app help"; "pitiable homeless children"; "a pitiful fate"; "Oh, you poor thing"; "his poor distorted limbs"; "a wretched life"	eals for
P: 0.125 O: 0 N: 0.875		Feedback!
2010 © SentiWordNet		Index
		٨

Figure 1: The SENTIWORDNET web interface with "Feedback!" button.

SentiWordNet ×			_ 0 ×
← → C 🗋 swn.isti.cnr.it/	search.php?q=pitiful		oi☆ 🍫 🔄 🗿 🕄 🔘 Ξ
	sorry#2 sad#3 pitiful#2 lamentable#1 distressing#2 deplorable#1		01126841
	bad; unfortunate; "my finances were in a deplorable state"; "a lamen	table decision"; "her clothes were in sad shape"; "a sorry state	of affairs"
1 1 1 1 2 2 3 4 4 4 5 4 5 6 5 7	SentiWordNet Evalutation	Yo	ur Evaluation
Lat.	·────────────────────────────────────	•	○ 0
	1		0.75
	0		
			Send Feedback
5,0,125,0,0,0,0,0,0,0			
2009-3:0070:05:0			

Figure 2: The feedback dialog.

Feedback from users has been collected in two ways: (i) from the Web interface, and (ii) from the download interface.

The Web interface allows the user to search for any term in WORDNET and shows all the synsets to which the term belong with the relative SENTIWORD-NET values. Each synsets has a "Feedback!" link that opens a feedback dialog



Figure 3: The feedback dialog presented when SENTIWORDNET is downloaded.

(see Figure 2) that allows the user to submit its suggested triplet of values (which can differ or be the same of the SENTIWORDNET triplet).

When a user clicks on the link to the download page of SENTIWORDNET the actual download link is presented along with a feedback dialog (see Figure 3) that presents the triplet for a synset and asks to the user to check them, confirm it or submit a triplet of corrected values. After the submission of the feedback the interface loads automatically the values for another synset, so that the user can submit feedback on other SENTIWORDNET triplets. Synsets are selected in random order among the set of synsets with the minimum number of feedbacks. This means, for example, that whenever a synset gets its first feedback, independently of the feedback source (web search, or download link), it will be never presented for feedback from the download link until *all* synsets will have at least one feedback too.

When users submit their feedback the information that is stored is:

- Original SENTIWORDNET values (positivity and negativity, the objectivity value can be determined as 1 - (posivitity + negativity)).
- The values submitted by the user (positivity and negativity).
- IP of the browser submitting the data.
- Time and date.

3 Releasing the feedback

Before releasing the feedback we faced with the requirement of preserving the privacy of the users that have contributed their feedback. At the same time we liked to save some information about the event that generated the feedback, which could be useful for the analysis of data.

We thus converted each IP to a unique identifier, so that it is still possible to group feedbacks generated by the same IP but not to determine its exact source. We also added the country in which the IP is located, by using the *WHOIS* protocol. Though the information obtained in this way is only a rough approximation of the location of the feedback source, and it does not provide any information about the fluency in English of the submitter, it can be useful for future analyses involving grouping or filtering based on geographic areas.

The exact time information has been removed, leaving only the date of submission.

The feedback entries are released in a text file, with a feedback entry per line, and each line composed of the following tab-separated field:

- Incremental counter: can be used as unique identifier of feedback entries.
- SynsetId: the offset in the WORDNET data file. Along with the part of speech it uniquely identifies the synset.
- Part of speech of the synset.
- SENTIWORDNET-positivity: the positivity value assigned to the synset in SENTIWORDNET at the time of feedback submission.
- SENTIWORDNET-negativity: same as above, for negativity.
- Feedback-positivity: the positivity value submitted by the user.
- Feedback-negativity: same as above, for negativity.
- Date of submission.
- Anonymized IP.
- Country in which the IP is locate: two letter country code, "xx" if not available.
- List of word#senseNumber pairs belonging to the synsets: attached to allow quick human inspection without need to search for the synset on WORDNET.

The feedback data can be downloaded from the SENTIWORDNET website. The feedback data is released under the *Creative Commons Attribution-ShareAlike 3.0 Unported (CC BY-SA 3.0)* license³.

4 User feedback statistics

A total of 3510 feedback entries have been collected (about 3.5 a day on average).

The feedback entries have been submitted from 1209 distinct IP addresses. The average is thus 2.9 entries per IP address, and the distribution follows a power law, as shown in Table 1.

With respect to the geographic origin of the feedback, 350 of the 1209 distinct IP addresses cannot be mapped to any country ("xx", in Table 2). The remaining IP addresses come from 72 countries, 35 of which have contributed at least 15 feedback submissions from at least 5 distinct IP addresses.

³http://creativecommons.org/licenses/by-sa/3.0/

	Number of IP addresses
f	with at least
	f feedback entries
1	1209
2	522
5	153
10	47
20	12
50	4
100	1
200	1

Table 1: Cumulative distribution of IP addresses with respect to the numberof feedback entries submitted.

Country	#IPs	#subs	Country	#IPs	#subs	Country	#IPs	#subs
XX	350	1063	SE	9	41	MA	2	12
IN	145	292	PH	9	21	BG	2	9
GB	59	189	IE	9	15	CU	2	9
DE	59	115	HK	9	14	JO	2	9
IT	54	324	RU	8	23	LB	2	4
CN	50	157	CH	7	35	MT	2	3
ES	32	64	NO	7	29	LK	2	2
FR	29	57	TN	6	36	NZ	2	2
NL	26	103	TH	6	33	QA	1	3
SG	24	40	DK	6	18	US	1	3
AU	22	55	VN	6	14	UY	1	3
BR	19	41	SI	5	25	KP	1	2
MX	17	33	CO	5	15	MO	1	2
RO	16	40	DZ	5	13	NP	1	2
PK	15	37	CL	5	10	VE	1	2
TW	15	28	PL	5	8	AR	1	1
KR	14	70	HU	4	45	BA	1	1
TR	14	25	FI	4	8	EC	1	1
ID	13	18	CZ	4	7	IQ	1	1
PT	12	85	EG	4	7	KE	1	1
JP	12	26	IR	4	7	LT	1	1
GR	11	29	AT	4	6	MK	1	1
MY	10	33	UA	3	15	SY	1	1
IL	10	28	HR	3	9			
BE	10	24	EU	3	5			

Table 2: Distribution of IP address and feedback submissions by country.

month/year	2010	2011	2012	2013
Jan		64	29	110
Feb		84	138	530
Mar		82	100	333
Apr		36	137	270
May		94	138	95
Jun	39	93	79	
Jul	10	49	52	
Aug	6	111	86	
Sep	8	57	101	
Oct	14	146	82	
Nov	10	61	109	
Dec	37	45	75	

The distribution in time of the feedback submissions (see Table 3) shows a first period, in 2010, with a relatively low number of submissions, a second period in 2011-2012 with a higher steady flow of submissions (85 per month on average) and a high peak in the first months of 2013.

Table 3: Distribution in time of feedback submissions.

Among all the feedback entries 2236 (63.7%) have the same exact values of the original SENTIWORDNET triplet. This in principle means that that feedback states the correctness of the relative SENTIWORDNET values, but there is also the possibility that part of that feedback has been generated by careless clicks on the feedback submission interface. The evaluation of feedback quality is beyond the scope of this report, though we are working on a number of improvements on the feedback collection process aimed at improving the quality of the collected feedback, as described in the next section.

5 Improving user feedback collection

While preparing feedback data we have noticed some weak points in the feedback collection process and we have designed some modification to the interface and the collected information in order to improve them.

The feedback submission interface presented from the download link is vulnerable to repeated submission of feedback that confirms the original SENTI-WORDNET values. This is due to the fact that that kind of submission has almost no "cost", i.e., it requires only to click the "Submit feedback" button, and that repeated click of that button does not even require to move the mouse. In order to limit the false confirmatory submissions we have added a confirmation dialog that asks to the user to actively confirm the submission of the feedback.

We noted also that there is a difference in the users' role between the two possible sources of feedback, i.e., the download link and the search interface. The feedback interface on the download link pushes requests of feedback to the users, with the synsets been evaluated selected by the interface, not by the users. Users may be thus not motivated to give their evaluation or also may not be prepared to evaluate a specific synset (e.g., being non-native speakers of the language). When users instead submit their feedback from the search interface,



Figure 4: The new, more informative, feedback area in the SENTIWORDNET web interface.

they do it on entries they have searched for. Moreover, the main purpose of the interface is not feedback submission and thus it is likely that when the user decides to submit feedback the submitted values are carefully thought.

In the original implementation of the feedback collection process we did not differentiate the sources of feedback. It is not possible, on the feedback data from this first release, to tell if the feedback comes from the download or the search interface. We have added this information to any feedback collected from now on.

We have also redesigned the original feedback area in the search interface, substituting the single "Feedback!" button (see Figure 1) with two buttons: one that explicitly confirms the correctness of the presented values and one that opens the dialog for the submission of an alternative triplet of values (see Figure 4).

References

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