# Dynamics of affective expression in social media: Supplementary materials

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## **Descriptive figures**

The trajectory of the expressed valence and arousal of three individuals in the dataset can be seen in Figure 1. Their baselines of expressed emotions are above the midpoint of the valence and below the midpoint of the arousal scale. They display the typical dynamics of valence and arousal as observed through self reports in previous research [1]: emotions can be excited to states of extreme arousal and valence, but they tend to come back over time to a baseline of positive valence and moderate arousal.





#### Longer time scales

We plot the relaxation of valence and arousal for a time interval of up to 5 hours.





#### **NRC-VAD** Lexicon

We repeat the analysis from the main text with the NRC-VAD lexicon [2] and report the results in Figure 4 & 5 and in Table 1.



Figure 4 Autocorrelation of valence and arousal in status updates using the NRC-VAD method. Correlation coefficients of subsequent status updates by the same user (correcting for individual baselines) after  $\Delta t$  seconds passed between them. Shaded areas are 95% bootstrap confidence intervals. Results are similar to the ones produced with the WKB method. First non-significance (95% bootstrap confidence intervals) after 159 seconds for valence and after 125 seconds for arousal.



Figure 5 Valence and arousal relaxation towards an affective baseline using the NRC-VAD method. The mean baseline-corrected value of the next status update after  $\Delta t$  seconds for bins of the valence and arousal of the previous status update of the same user. Means are calculated over a rolling window of size 15 (seconds) over all status updates of all users and plot up to a maximum  $\Delta t$  of 300 seconds. Results are similar to the ones obtained with the WKB text analysis method.

 Table 1 Regression results using the NRC-VAD method.

	Valence Model NRC-VAD			Arousal Model NRC-VAD		
	Coef.	CI	p-Value	Coef.	CI	p-Value
k	0.368	[0.363, 0.374]	$p < 10^{-16}$	0.425	[0.419, 0.432]	$p < 10^{-16}$
gamma	0.0049	[0.0047, 0.0051]	$p < 10^{-16}$	0.0093	[0.0089, 0.0096]	$p < 10^{-16}$
N		17,732,043			17,732,043	

#### Week correction

We follow the "ISO week date system" [3] to map the time stamps of status updates to the corresponding week. To exclude the effect of phenomena like holiday greetings, we compute weekly baselines (Figure 6 & 7) and rerun analysis with a weekly baseline correction. Results are robust to this change (Figure 8 and Table 2).



Figure 6 Weekly baseline for valence over all users for all weeks in the data set. Note the increase in valence towards the end of the year (Christmas, New Year's Eve).





Figure 8 Autocorrelation of valence and arousal in status updates (derived from the WBK lexicon) after correction of weekly baselines. Correlation coefficients of subsequent status updates by the same user (correcting for individual baselines) after  $\Delta t$  seconds passed between them. Shaded areas are 95% bootstrap confidence intervals.

 $\label{eq:table_$ 

	Valence Model			Arousal Model		
	Coef.	CI	p-Value	Coef.	CI	p-Value
k	0.385	[0.379, 0.392]	$p < 10^{-16}$	0.449	[0.442, 0.456]	$p < 10^{-16}$
gamma	0.0068	[0.0065, 0.0072]	$p < 10^{-16}$	0.0105	[0.0102, 0.0109]	$p < 10^{-16}$
N		16,863,066			16,863,066	

### VADER

We also considered using the tool VADER [4] for sentiment analysis. A VADER compound value of 0 does not only refer to neutral sentiment in a tweet but also to "not detected". Therefore, it is advised to follow the example of the authors and classify the scale into "negative", "neutral" and "positive" "... with classification thresholds set at -0.05 and +0.05 ..." [4, p. 224]. The histogram of VADER scores in our dataset can be seen on Figure 9. The trimodality of scores shows that VADER was calibrated with ternary sentiment data.



#### Author details References

Kuppens, P., Oravecz, Z., Tuerlinckx, F.: Feelings change: Accounting for individual differences in the temporal dynamics of affect. Journal of Personality and Social Psychology 99(6), 1042–1060 (2010). doi:10.1037/a0020962

- 2. Mohammad, S.: Obtaining Reliable Human Ratings of Valence, Arousal, and Dominance for 20,000 English Words, pp. 174-184. Association for Computational Linguistics, Melbourne, Australia (2018). https://www.aclweb.org/anthology/P18-1017
- 3. ISO week date. Page Version ID: 921344717 (2019).
- https://en.wikipedia.org/w/index.php?title=ISO\_week\_date&oldid=921344717 Accessed 2019-10-31
  Hutto, C.J., Gilbert, E.: Vader: A parsimonious rule-based model for sentiment analysis of social media text. In: ICWSM '14 (2014)