

ARTICLE INFORMATION

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REFERENCES

1. Cialdini RB, Demaine LJ, Sagarin BJ, Barrett DW, Rhoads K, Winter PL. Managing social norms for

persuasive impact. *Soc Influ.* 2006;1(1):3-15. doi:10.1080/15534510500181459

2. Tellis GJ, Ambler T, eds. *The SAGE Handbook of Advertising*. Thousand Oaks, CA: SAGE Publications; 2007.

3. Company @ About.Twitter.com. <https://about.twitter.com/company>. Accessed August 22, 2016.

4. Twitter usage statistics. <http://www.internetlivestats.com/twitter-statistics/>. Accessed February 22, 2016.

5. Creswell JW. Mixed methods procedures. In: *Research Design: Qualitative, Quantitative, and Mixed Methods Approaches*. 3rd ed. Thousand Oaks, CA: SAGE Publications; 2009:203-226.

6. Zeng QT, Tse T. Exploring and developing consumer health vocabularies. *J Am Med Inform Assoc.* 2006;13(1):24-29.

7. Lindberg DA, Humphreys BL, McCray AT. The Unified Medical Language System. *Methods Inf Med.* 1993;32(4):281-291.

8. Schwartz HA, Eichstaedt JC, Kern ML, et al. Personality, gender, and age in the language of social media: the open-vocabulary approach. *PLoS One.* 2013;8(9):e73791.

9. Sap M, Park G, Eichstaedt J, et al. Developing age and gender predictive lexica over social media. <http://citeseerx.ist.psu.edu/viewdoc/summary?doi=10.1.1.672.9851>. Accessed February 19, 2016.

10. Eichstaedt JC, Schwartz HA, Kern ML, et al. Psychological language on Twitter predicts county-level heart disease mortality. *Psychol Sci.* 2015;26(2):159-169.

Editor's Note

Twitter and Cardiovascular Disease Useful Chirps or Noisy Chatter?

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As modern society continues to organize around a digital, connected way of life, information from our daily interactions and exposures are now measured, recorded, and memorialized in



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ways previously unimaginable. This tapestry of information includes data from social media or electronic tools, such as websites and applications, that enable users to create, share, and exchange content.¹ Twitter is one such social networking service whose 310 million active users post short public messages known as Tweets.

In this issue of *JAMA Cardiology*, Sinnenberg and colleagues² explore the characteristics of Twitter users and Tweets associated with cardiovascular disease. They found a large volume of Tweets (4.9 million) on cardiovascular disease and were able to characterize tone, style, and perspective of these Tweets, as well as some basic demographics of

the users posting them. Most notably, Sinnenberg and colleagues found that Tweet volume and content were temporally associated with news events that were thematically connected with cardiovascular disease.

This brief report differs from much of the original investigation in *JAMA Cardiology*. We accepted it because it highlights the potential for using these emerging data sources such as Twitter for cardiovascular research, in this case to evaluate public communication about cardiovascular medicine in a manner not previously possible on such a scale. Furthermore, application programming interfaces allow persons with basic coding skills to mine these data as well as data from other social media platforms, which are often publicly accessible, thereby adding to the mix of open data and potentially engaging investigators and data scientists outside the traditional venues of cardiovascular research. Other uses of social media in areas related to clinical care or research are rapidly being ex-

plored, including drug safety surveillance by the US Food and Drug Administration,³ monitoring of prescription medication abuse, recruitment and conduct of clinical trials, and as an intervention to improve caregiver and peer support for, education in, and management of chronic diseases.⁴

Still, the use of Twitter and other social media platforms for cardiovascular research is in an early, proof-of-concept stage. Many important questions remain: Is there signal in the noise? Are these data or results (social media-enriched clinical

trials) from the “Twitterverse” generalizable to a broader population? What are the methodological standards for analysis? Are there ethical issues in linking these data with medical or clinical information?

Although digital health, broadly defined, is in its infancy, the evidence development for digital health is a major priority for *JAMA Cardiology*. We encourage our readers to submit relevant and timely original investigations and viewpoints on this topic.

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Additional Information: Drs Turakhia and Harrington can be reached on Twitter at @leftbundle and @HeartBobH, respectively. Follow *JAMA Cardiology* on Twitter at @jamacardio.

1. Weber GM, Mandl KD, Kohane IS. Finding the missing link for big biomedical data. *JAMA*. 2014;311(24):2479-2480.

2. Sinnenberg L, DiSilvestro CL, Mancheno C, et al. Twitter as a potential data source for cardiovascular disease research [published online September 28, 2016]. *JAMA Cardiol*. doi:10.1001/jamacardio.2016.3029

3. Freifeld CC, Brownstein JS, Menone CM, et al. Digital drug safety surveillance: monitoring pharmaceutical products in twitter. *Drug Saf*. 2014;37(5):343-350.

4. Patel R, Chang T, Greysen SR, Chopra V. Social media use in chronic disease: a systematic review and novel taxonomy. *Am J Med*. 2015;128(12):1335-1350.