

Spatial differences in exposure to HPV vaccine information on Twitter and its association with coverage

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*Global Challenges in Vaccine
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Acknowledgements

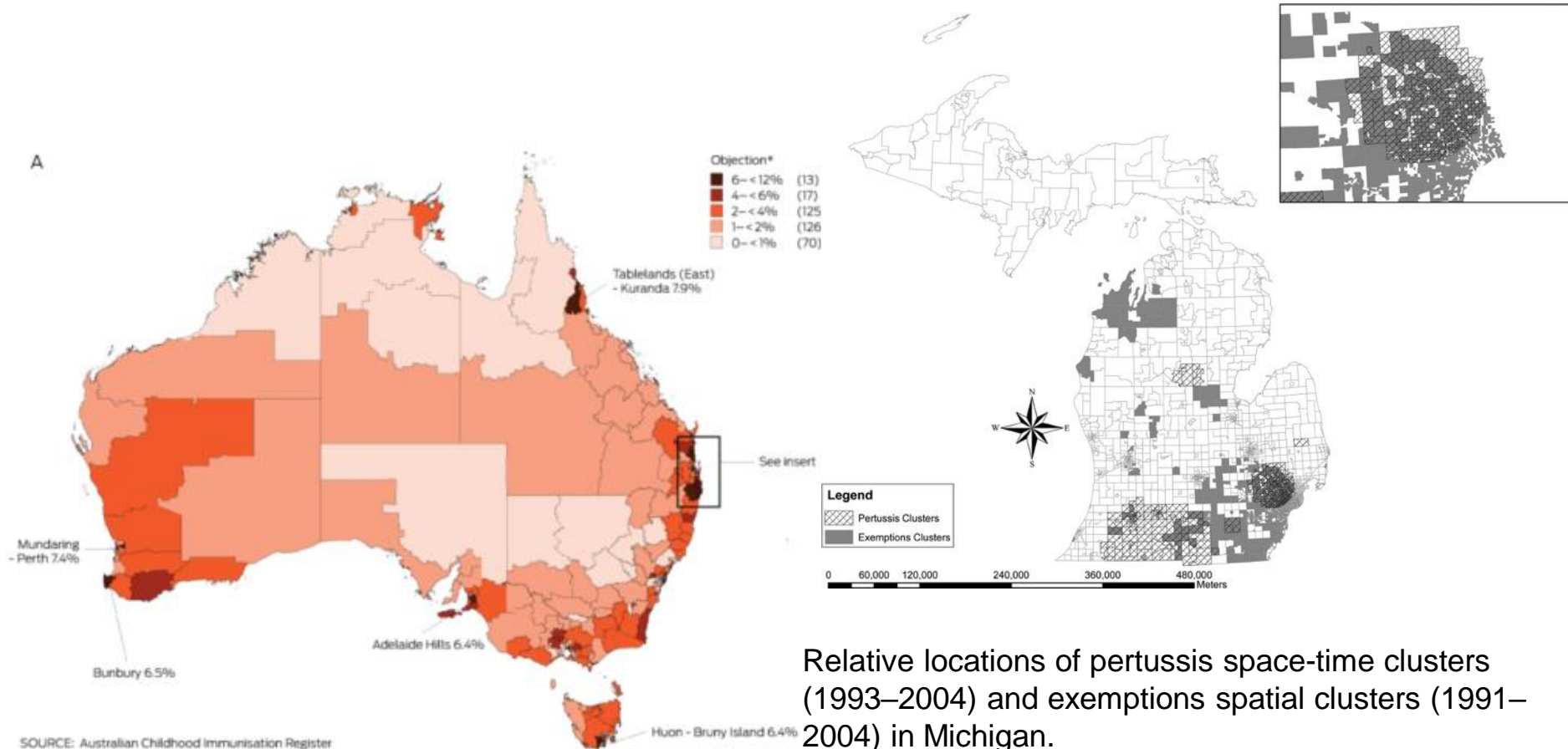
Adam Dunn, Didi Surian, Enrico Coiera, Centre for health Informatics, Macquarie University

Aditi Dey, National Centre for Immunisation Research and Surveillance

Ken Mandl, Harvard Medical School



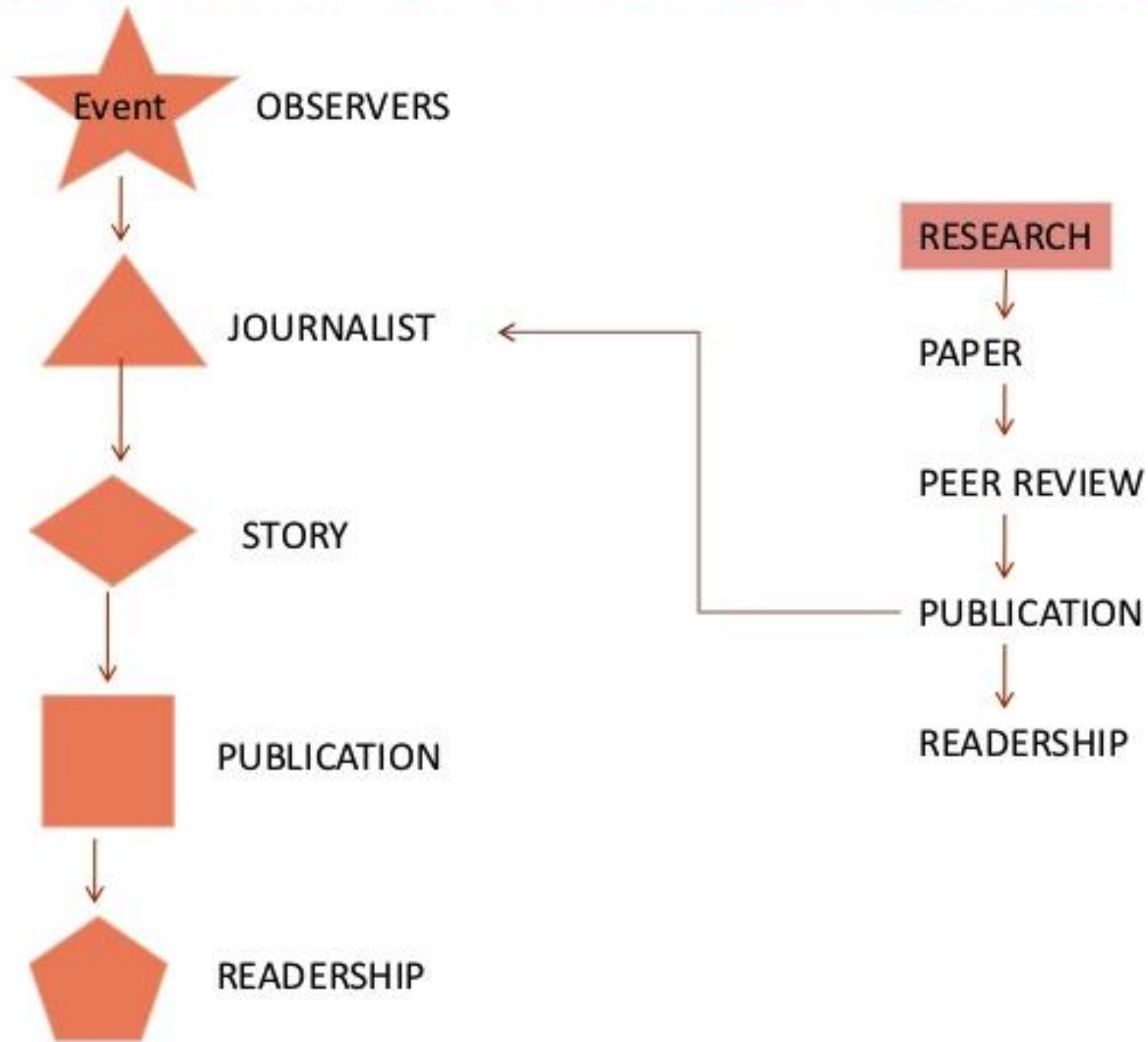
Geographic networks influence sentiment and dx transmission



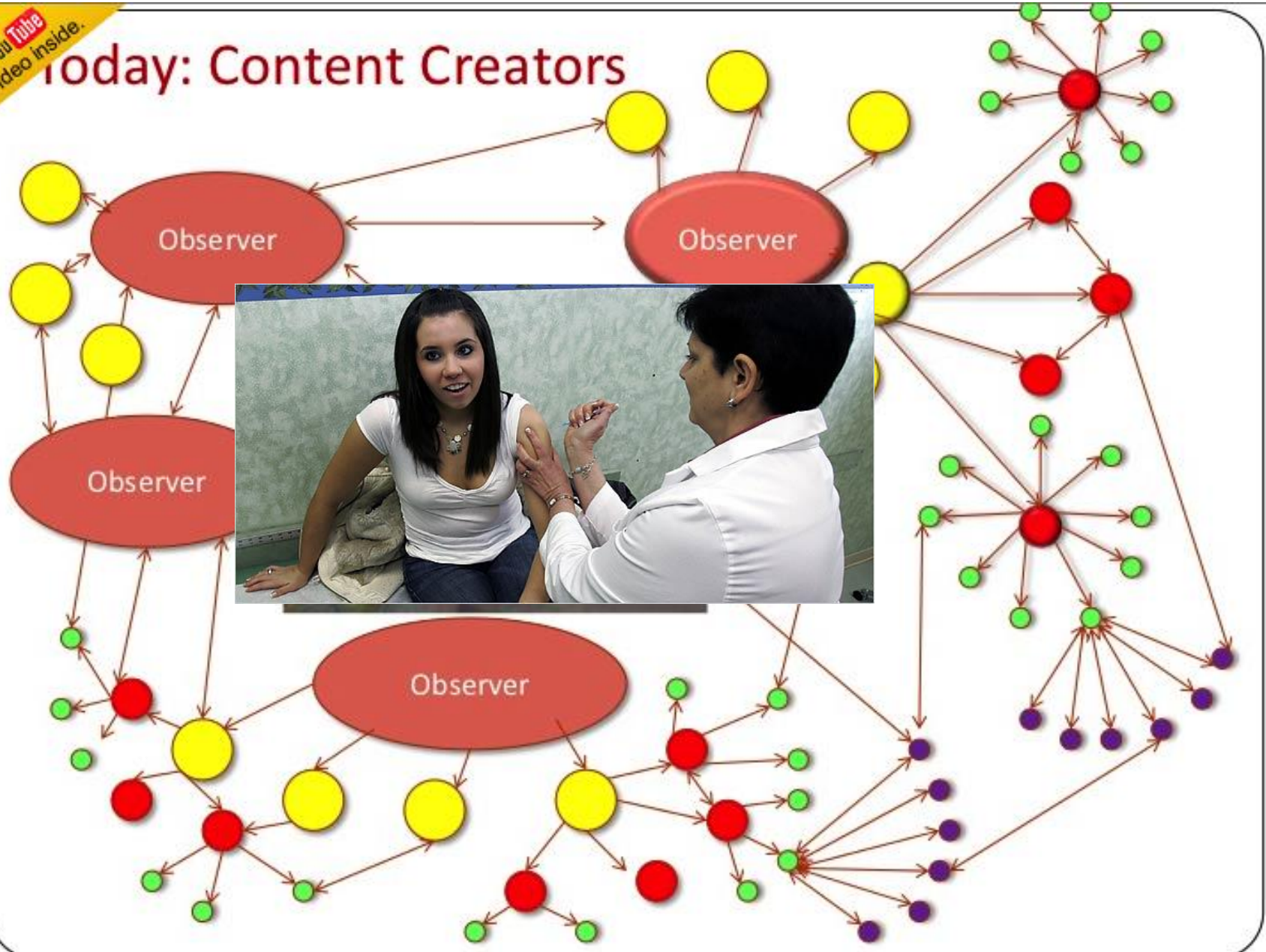
Saad B. Omer et al. Am. J. Epidemiol. 2008;168:1389-1396

What about online networks?

The world as we knew it! Content Consumers

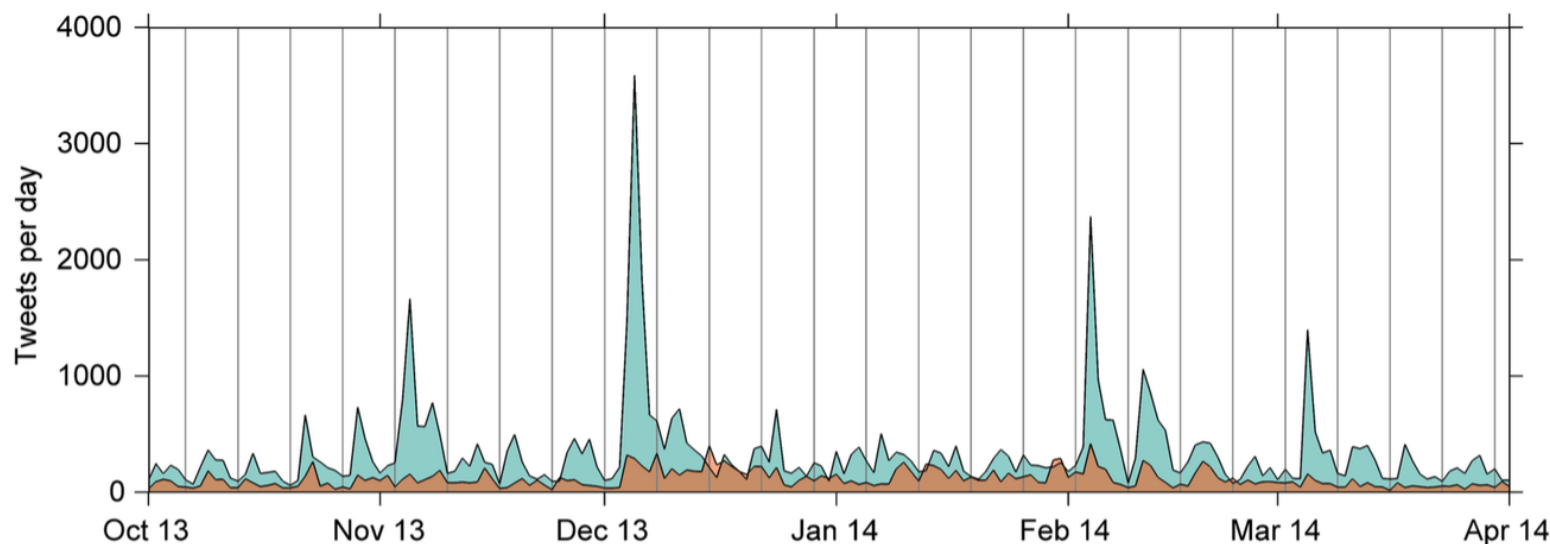


Today: Content Creators



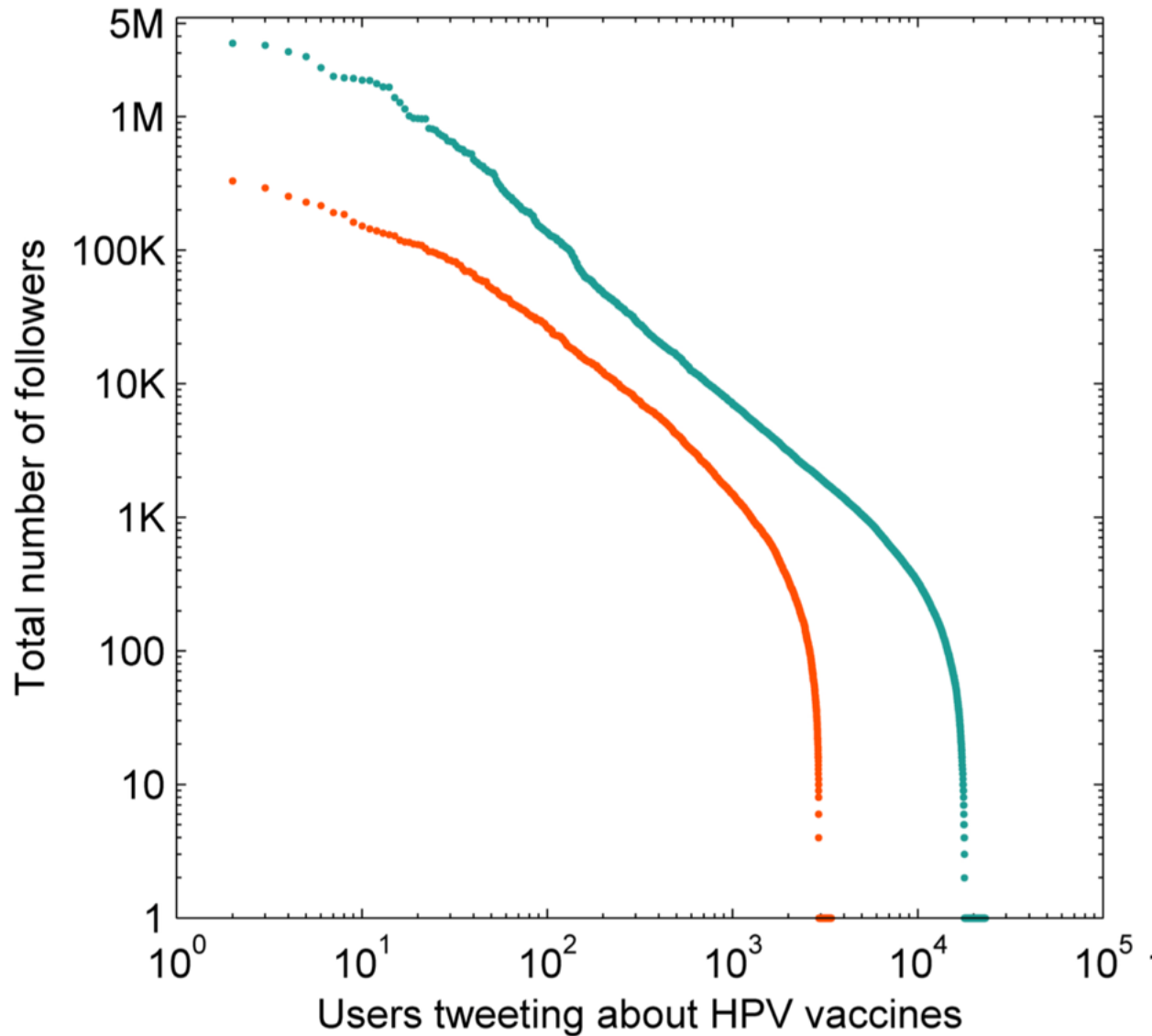
You can count tweets but...

Figure 1. The number of tweets posted each day during the data collection period, including tweets rejecting the safety or value of HPV vaccines (orange) and all other HPV vaccine tweets (cyan). Gray vertical lines indicate Sundays. No corrections for time zone differences were applied.

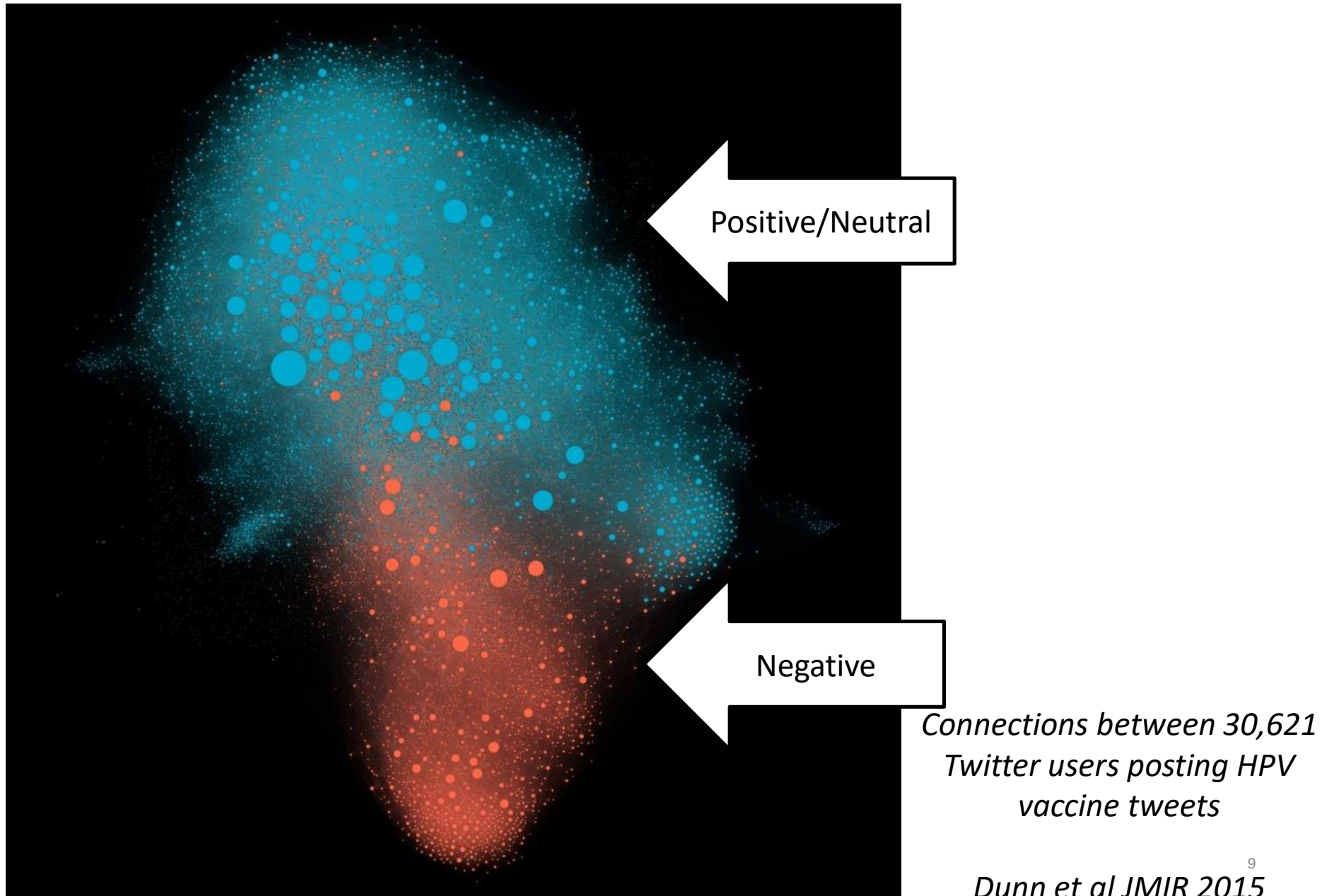


Dunn AG, Leask J, Zhou X, Mandl KD, Coiera E. Associations between exposure to and expression of negative opinions about human papillomavirus vaccines on social media: an observational study. *Journal of Medical Internet Research* 2015;17(6):e144

counting tweets won't tell you about reach



Measuring exposure to tweets is one option



Exposure won't tell you about behavioural impact



Aim

To determine whether state level differences in exposure to information on Twitter about HPV vaccines were associated with state level differences in HPV vaccine coverage.



Contents lists available at [ScienceDirect](https://www.sciencedirect.com)

Vaccine

journal homepage: www.elsevier.com/locate/vaccine



Mapping information exposure on social media to explain differences in HPV vaccine coverage in the United States

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Methods

- State level coverage NIS 13-17 years
- 10,084 females and 10,743 males in 2014
- 10,508 females and 11,367 males in 2015
- Measure of poverty, racial and ethnic composition, insurance coverage, education from 2014 census
- Tweets collected between 1 October 2013 and 30 October 2015 using API which repeatedly searches for tweets that include “Gardasil, Cervarix, hpv + vaccine*, cervical + vaccin*"
- 273.8 million exposures to 258,418 tweets
- Classified by topic using machine learning methods.
- Compared the models with those based on insurance, income, education, and race/ethnicity.

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🔗 [sydney.edu.au/medicine/people/...](https://sydney.edu.au/medicine/people/julie-leask)

📅 Joined July 2009

Results

Distribution of 219.7 million potential exposures to HPV vaccine tweets by county

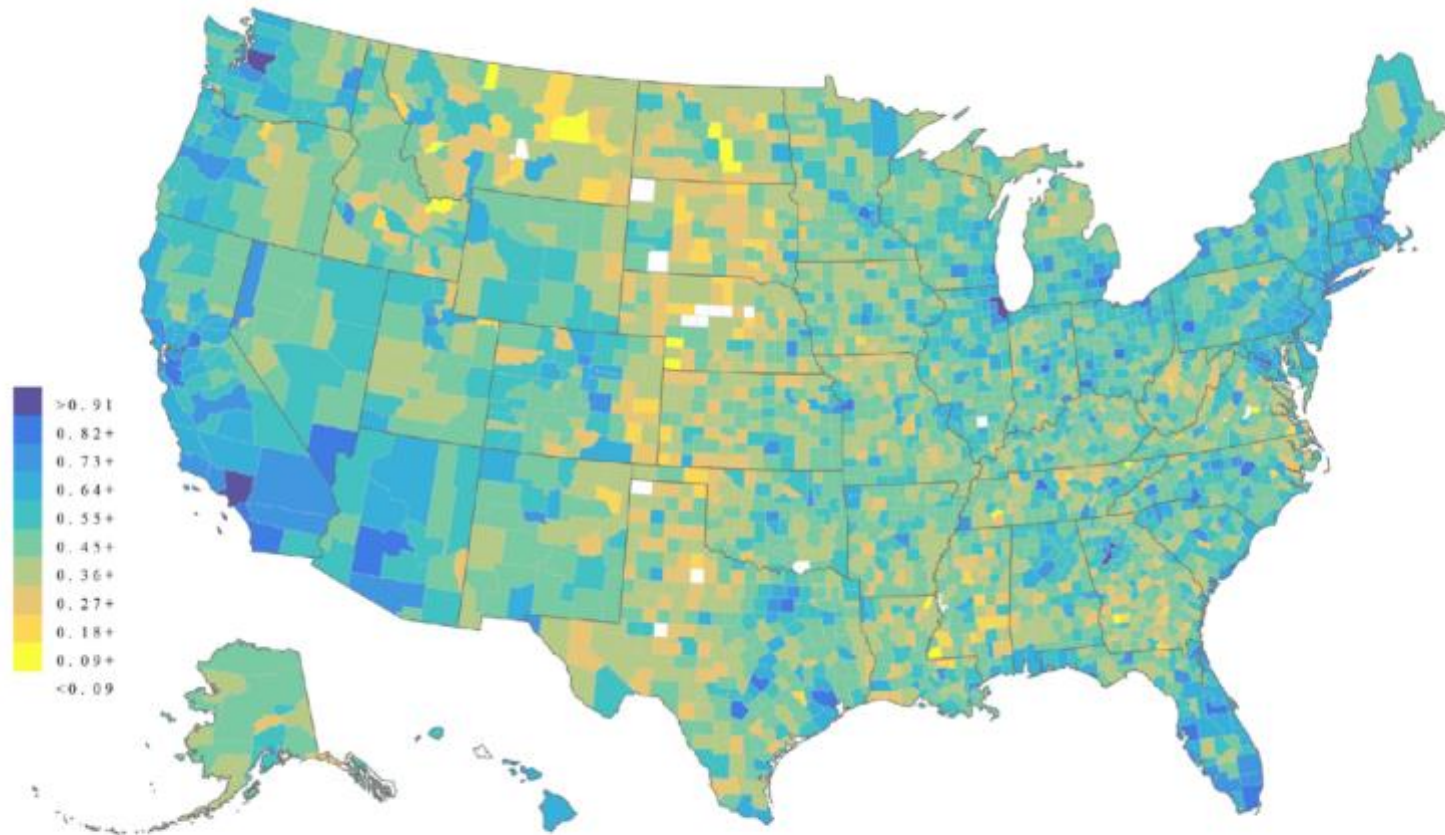
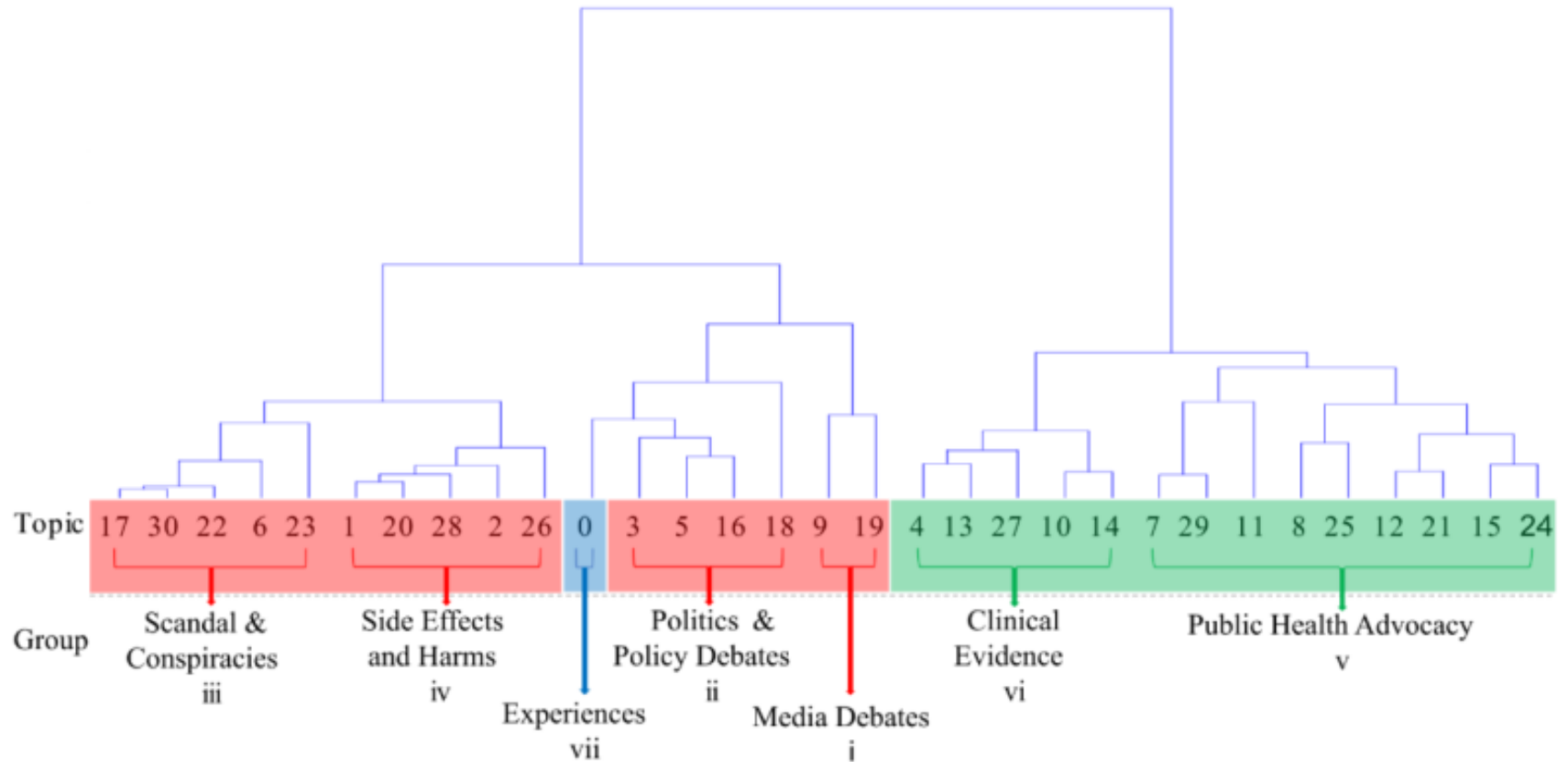


Fig. 1. The distribution of the 219.7 million potential exposures to HPV vaccine tweets by county. Colors are given by each county's percentile among total exposure counts, ranging from 0 to 19.7 million (New York County, NY). (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)

Topic modelling



Example tweets from Topic 26:

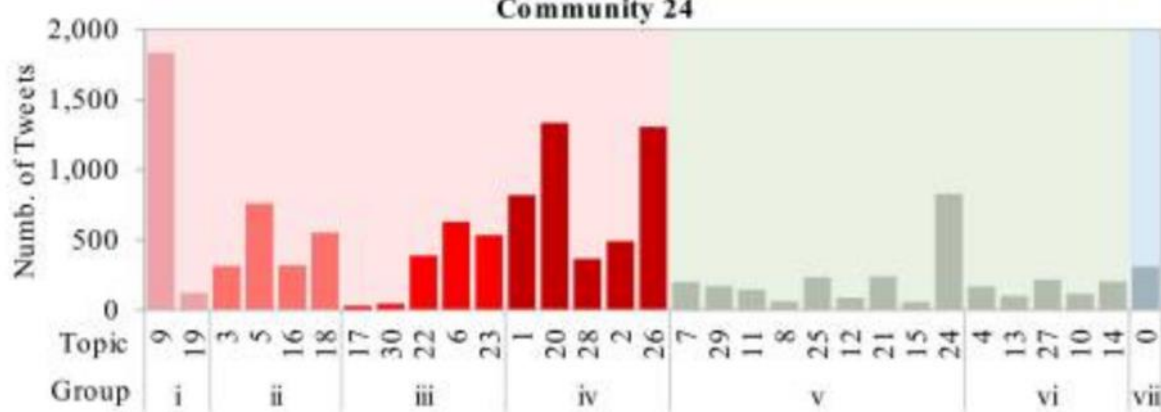
- “#Gardasil #Vaccines "They've been robbed of their womanhood:" Two sisters face one life-changing diagnosis <http://to.fox6now.com/...>”
- “Please don't give the HPV vaccine to your boys or girls. <http://www.wnd.com/...>
<https://www.youtube.com/...>
<http://healthimpactnews.com/...>”

Example tweets from Topic 27:

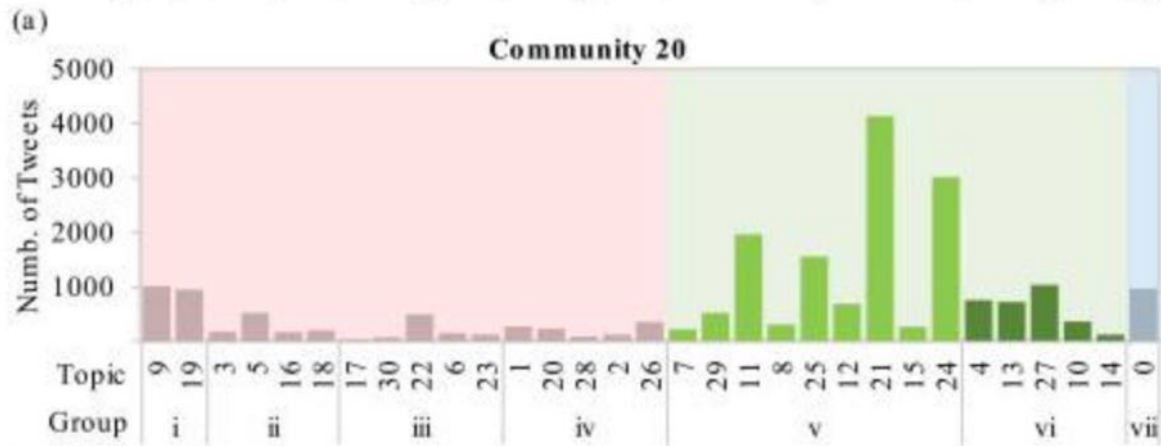
- “New HPV vaccine could protect against 90% of cases of cervical cancer following a trial of more than 14,000 women <http://www.dailymail.co.uk/...>”
- “The quadrivalent vaccine may protect from cervical abnormalities.#HPV #Vaccine <http://www.bmj.com/...>”

Example tweets from Topic 0:

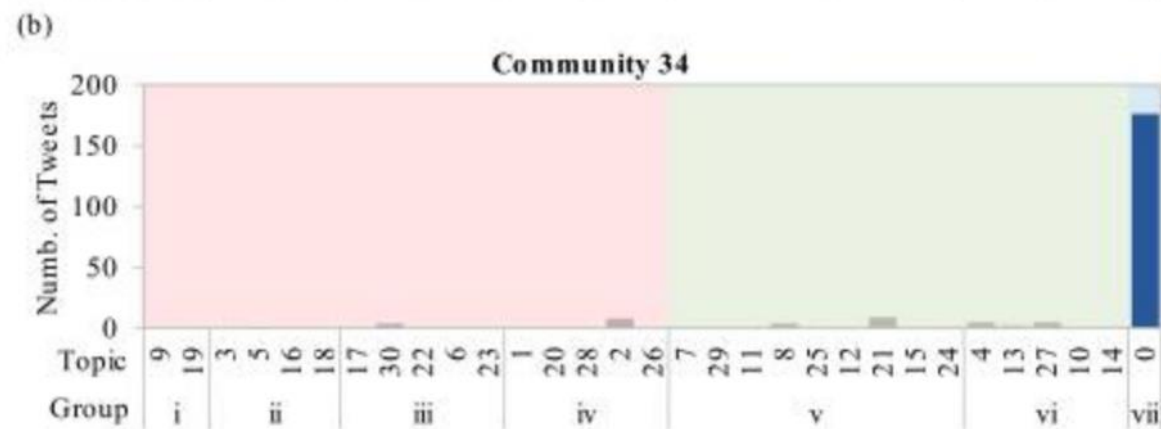
- “Got my 3rd HPV vaccine yesterday and my arm still hurts like a bitch 🤔”
- “If u had the gardasil shot at the doctors u know that bitch hurts bad lmaoo and it leaves ur arm sore af for like a week”



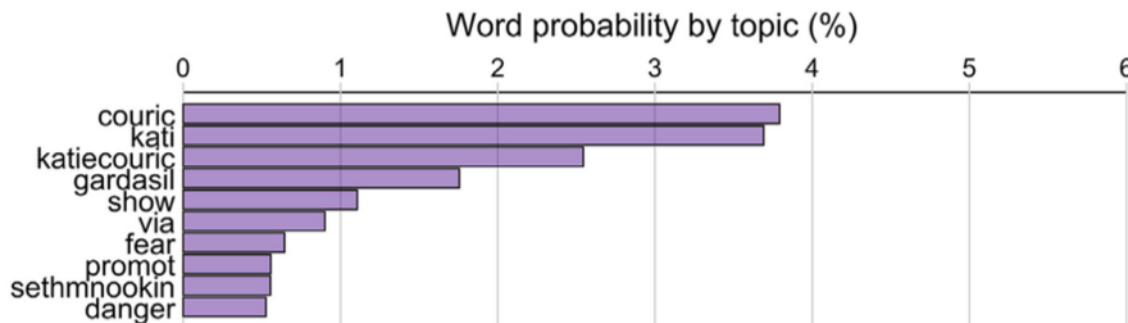
5275 users, 2.46 tweets per user
More harms/conspiracy



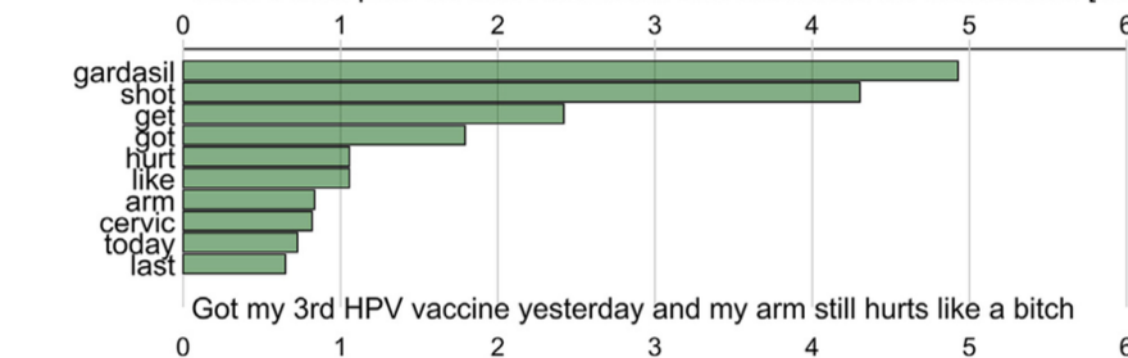
11,047 users, 1.96 tweets per user
More evidence/advocacy



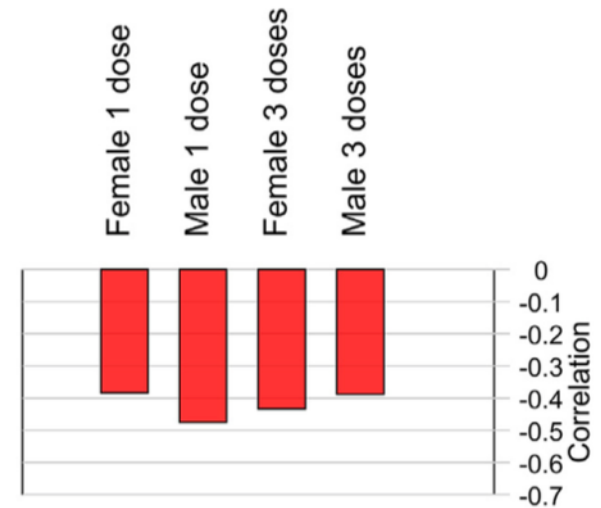
187 users, 1.16 tweets per user
More experiential



Katie Couric puts the anti-vaccination movement into the mainstream [latimes.com] A Disservice to all #katiecouric #HPV



Got my 3rd HPV vaccine yesterday and my arm still hurts like a bitch



STAR INVESTIGATION

A wonder drug's dark side

Hundreds of thousands of teen girls in Canada have safely taken **Gardasil**, a vaccine shown to prevent HPV. But a Star investigation has found that since 2008, at least **50 Canadians** experienced debilitating illnesses after inoculation. Patients and parents say the incidents point to the importance of **full disclosure** of risks

DAVID BRUSER AND JESSE MCLEAN

By the time Kathryn Armstrong received her third and final injection of the popular HPV vaccine Gardasil, pain had spread through the Whitney teen's body, migrating from her back to her knees to her hips.

After her first dose, Natalie Kenzie of London developed egg-size lumps on the soles of her feet, her joints swelled and her limbs twitched uncontrollably.

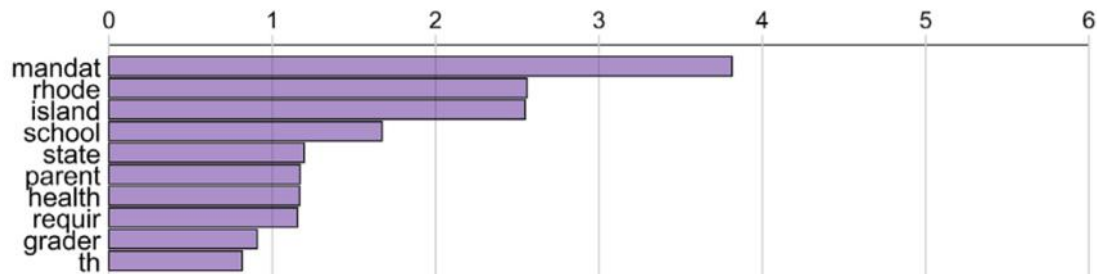
Before getting the shots, both 15-year-old girls were told the vaccine had no significant risks. And as they struggled to learn what ailed them, and began to believe Gardasil played a role, doctors dismissed their concerns.

Hundreds of thousands of teenage girls in Canada have received the vaccine's three doses, the vast majority without incident.

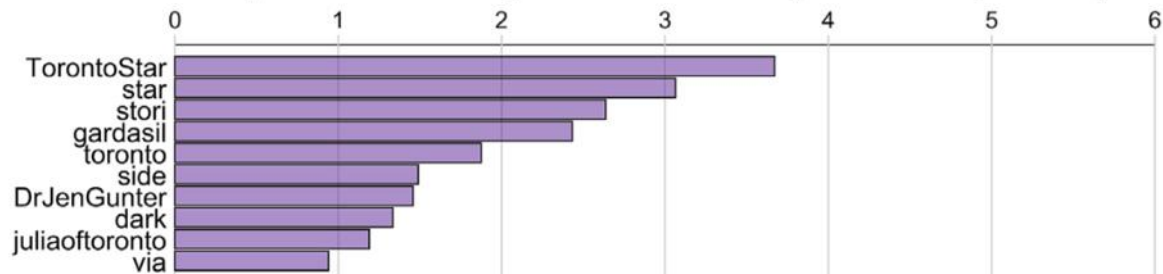


“There was a bad story-management combination approved by me: a foreboding headline, undue emphasis on the front page and terrible timing.

Word probability by topic (%)

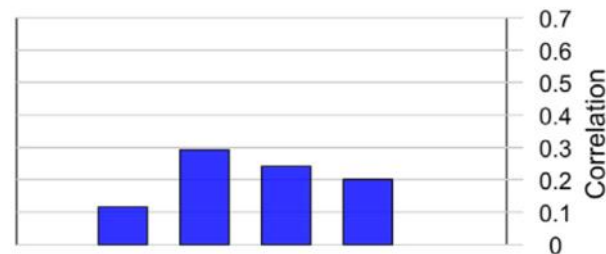
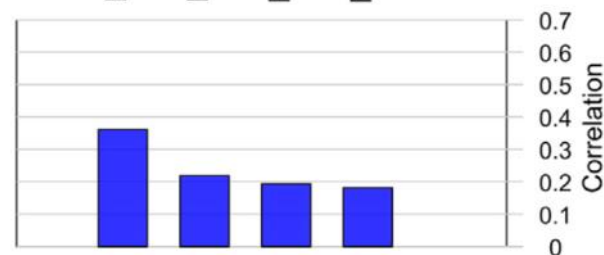


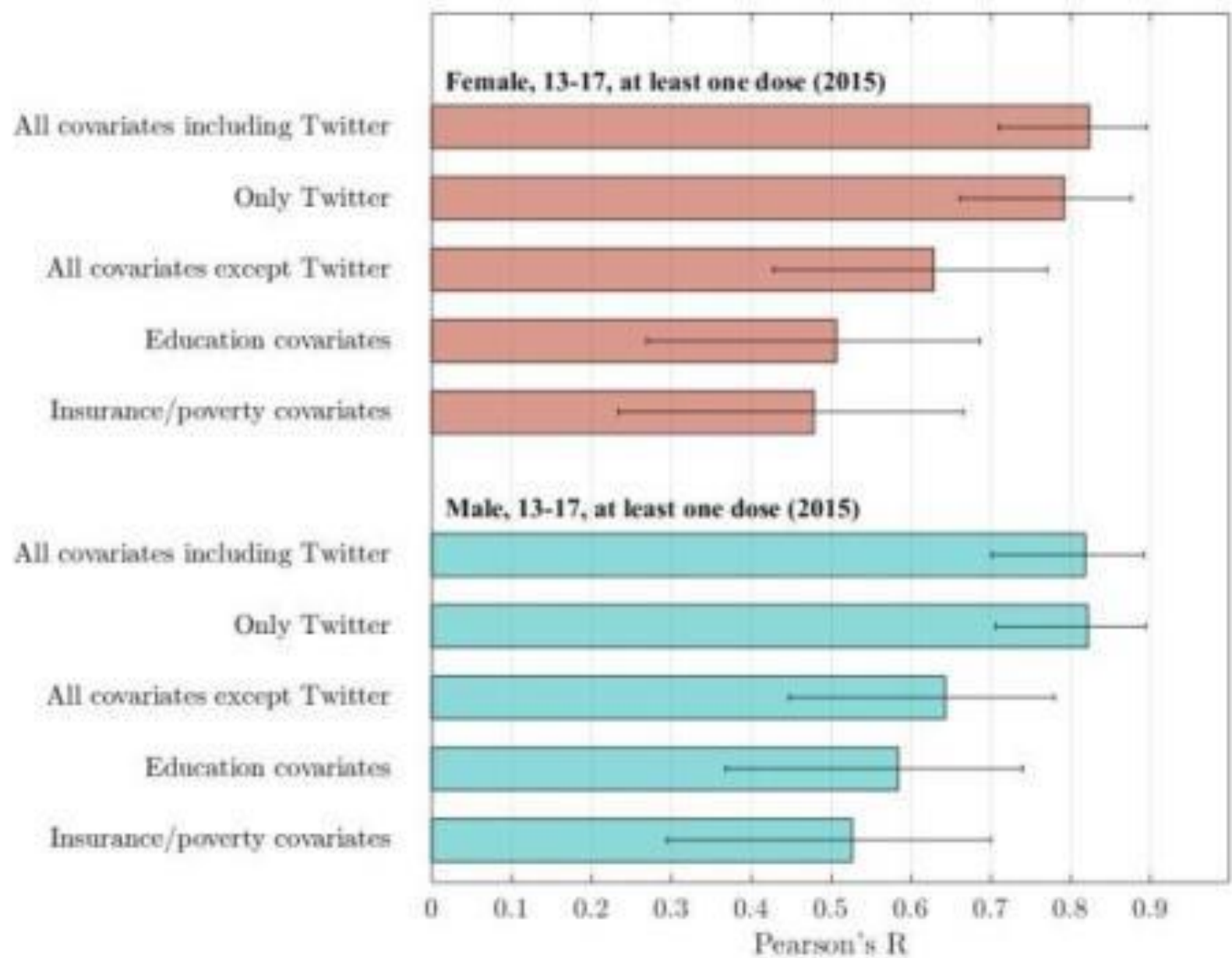
RI Dept. Health meets with parents about mandatory HPV vaccine [abc6.com]



Apology from @TorontoStar editor welcomed. Now to continue the damage control \$ inform about #Gardasil responsibly [thestar.com]

Female 1 dose
Male 1 dose
Female 3 doses
Male 3 doses





Limitations

We did not show direction of effect

Only Twitter

Uncorrected for differences in demographics between whom we measure and their population

Discussion

- In the US and with HPV vaccine, measures of information exposure derived from Twitter explained differences in coverage not explained by socioeconomic factors
- Vaccine coverage was lower in states where safety concerns, misinformation, and conspiracies made up a higher proportions of exposures
- Coverage most closely correlated with topics in mainstream news media (Couric, Toronto Star and advocacy)
- Socio-economic factors remain significant - insurance and poverty Pearson's R 0.62 for females 3 doses (Twitter only 0.78)
- On Twitter (and elsewhere) young people are describing their HPV vaccination experiences

Conclusions

- Efforts to reduce socio-economic barriers remain important.
- Twitter sentiment is likely to reflect and predict behaviour
- Twitter data has potential as a surrogate indicator for localised differences in acceptance.
- Routine systems to monitor exposure could identify where misinformation is over represented and guide interventions.
- The young person's vaccination experience is important. Young people can lack knowledge, feel anxious and find pain difficult. Strategies to assist them are known and effective.*
- Our research is now focusing on machine learning of information quality. We will correlate child vaccination coverage with sentiment and information quality.

Davies C, Skinner SR, et al (2017)'Is it like one of those infectious kind of things?'
The importance of educating young people about HPV and HPV vaccination at
school, Sex Education, 17:3, 256-275,

Thank you



Australian Collaboration of Social Sciences in Immunisation
COSSI