

Infodemiology.

Andrzej Jarynowski, Vitaly Belik

Institute of Veterinary Epidemiology and Biostatistics, Freie Universität Berlin, Germany

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Outline

- 1) Introduction to infodemiology (the traditional and social-content media on the Internet in pandemic)
- 2) Examples then infodemiology supporting and supplementing traditional public health repertoire
- 3) Examples then infosurveillance could suppress traditional medical research (clinical trials and registries)
- 4) Roadmap for analysis of German Internet

Infodemic

- ▶ traditional vs social-content media
- ▶ a concept in the social medicine area: “lay-referral framing system” where opinions and beliefs of the general public are something different from medical knowledge.
- ▶ information is widely treated as a trigger of consequences impacting daily-life security
- ▶ participatory epidemiology

History of Infodemiology and infosurveillance

- ▶ Google Flu Trends (2010) - syndromic infosurveillance using ILL keywords.
- ▶ Infosurveillance in prediction/forecasting COVID-19 infection dynamics worked far below expectation in Europe for publicly available dataset (i.e. Lamos, Vasileios, et al. "Tracking COVID-19 using online search." NPJ digital medicine 4.1 (2021): 1-11.), but seems to work with much more precise dataset in China (i.e. Guo, Shuhui, et al. "Improving Google flu trends for COVID-19 estimates using Weibo posts." Data Science and Management 3 (2021): 13-21.)
- ▶ High expectation, little predictive power (low digitalization rates and lack of availability of individual records in Western societies?)

Infodemiology as supporting tool for public health

- ▶ Measuring the social interest in/around SARS-CoV-2 and COVID-19 in the Internet media during the epidemic
- ▶ Quantifying dynamics of interest (demand and supply of content) and discourse patterns.
- ▶ Internet as a digital footprint of social activities (secondary document analysis)
- ▶ Media Analysis of the social processes. SEO-marketing solutions as SentiOne (used by Infodemic management by WHO)
- ▶ Serves as a complement to longitudinal surveys monitoring public perception (and other socio-economic methods) in REAL TIME

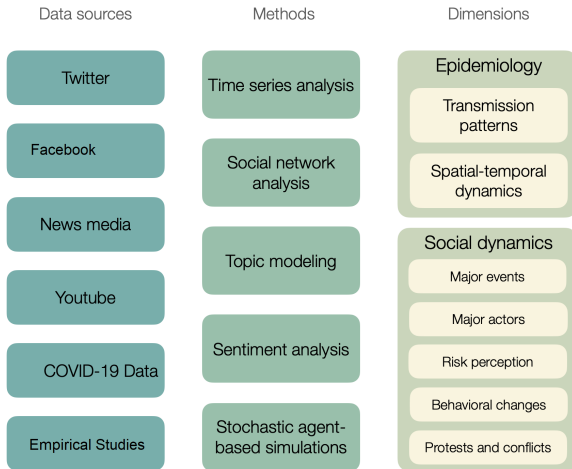
WHO Infodemiological intelligence

Part of Hub for Pandemic and Epidemic Intelligence in Berlin



<https://www.who.int/news/item/01-09-2021-who-germany-open-hub-for-pandemic-and-epidemic-intelligence-in-berlin>

Methodologies and goals



Scheme of the proposed infodemiological project, We aim to infer the interplay between social dynamics as revealed via Internet media and epidemiology of COVID-19 (only major data sources are shown) deploying the methods presented.

Think globally, act locally

- ▶ What? (content (key vocabulary, topics and sentiment) as on risk communication, fake news etc.)
- ▶ Who? (categories of senders of information, Who are main actors and communities in discourse)
- ▶ When? (timeline, how does perception of disease evolve?),
- ▶ Where? (geography, cross-regional comparison)
- ▶ How? (providing new information or blocking existing channels, Which factors affect risk perception and adherence to NPI?)

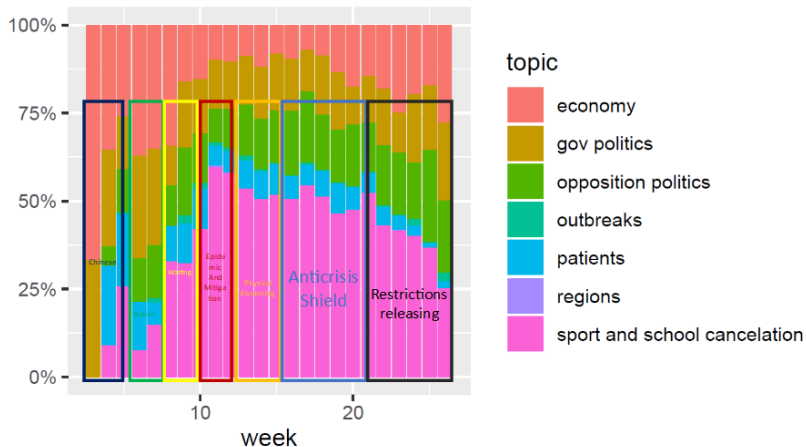
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Topic Modelling of News in Poland

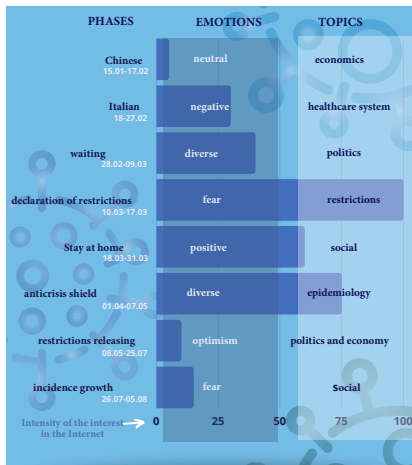
Social aspects are dominating!

topic distribution



Weekly dynamics of media perception in Poland. Main Topics in over 50 thousand news articles (without garbage codes).

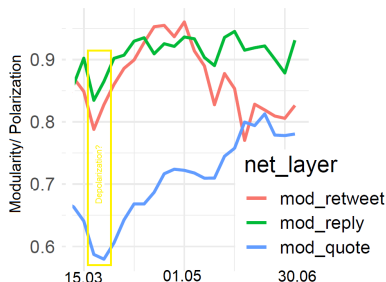
Interest in “Coronavirus” in Poland (multiple media source)



Jarynowski, Andrzej, Monika Wójta-Kempa, and Vitaly Belik. “Trends in interest of COVID-19 on Polish Internet.” *Epidemiol Rev* 74 (2020): 258-275.

Polarization in Polish Twitter

The (de-)polarization (revealed by modularity and sentiment analysis)



Modularity of the full networks (over 30 thousands accounts) and their weekly dynamics for different type of communication relations (retweeting, reply, quotation).

Jarynowski, Andrzej, et al. "Social Cohesion During the Stay-at-Home Phase of the First Wave of the COVID-19 Pandemic on Polish-Speaking Twitter." LNCS in press (2021).

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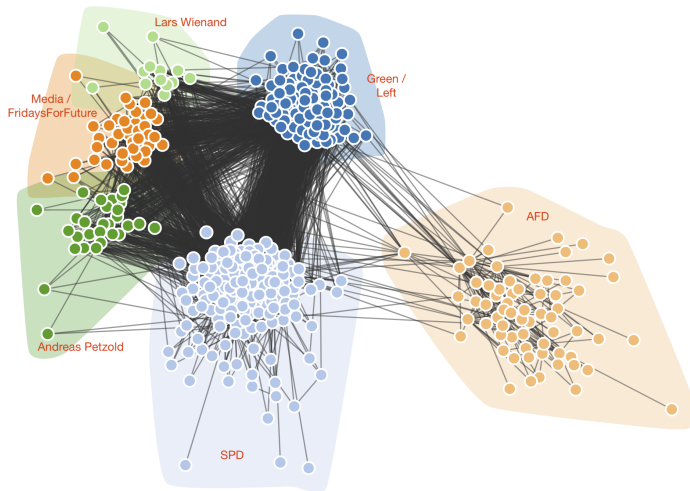
Protest in Berlin (Twitter)

We have collected tweets in German language with hashtags B0108 (92,474) and B2908 (345,992) for both main demonstrations on August 1st and August 29th, 2020 in Berlin.

For Twitter data we can deploy the temporal network analysis of users (here retweets), and simple NLP.

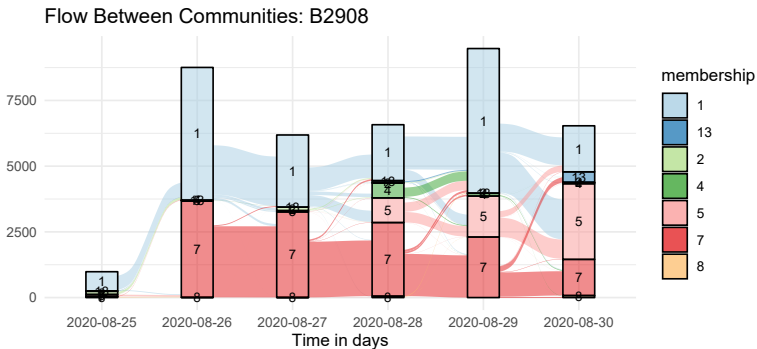
Jarynowski, Andrzej, Alexander Semenov, and Vitaly Belik. "Protest perspective against COVID-19 risk mitigation strategies on the German Internet." International Conference on Computational Data and Social Networks. Springer, Cham, 2020.

Protest in Berlin (01.08.2020) on Twitter



We observe such a mosaic pattern in German protests when representatives of AfD party as well as the SPD and the Green parties were connected on the retweet network during 01.08.2020 Berlin protests with hashtag b0108

Protest in Berlin (29.08.2020) on Twitter



Flow of users between communities with the biggest communities on the retweet network. Codes for the main identified communities: 1 – SPD and mainstream (anti-protest); 5 – Antifa (anti-protest); 7– AfD (pro-protest); 4 – community of left-wing liberals (anti-protest); 13 – liberal and more acceptable to protests

Vaccine context on German Twitter

Net of hashtags and actors

Conclusions

- ▶ The COVID-19 epidemic in the Internet is primarily of a social, not medical, dimension;
- ▶ Role Social media in driving social processes doesn't need to be always negative;
- ▶ Infodemiology **is very usefull** in understanding social dynamics during pandemic a supplementary role to standard tools as surveys;
- ▶ Infosurveillance **could be usefull** for public health decision makers in some specific areas too.