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## Beyond twitter

Exploring bluesky.social for digital disease detection and prototyping a data extraction pipeline for ILI surveillance

Heiner Atze, MSc, PhD

Digital Epidemiology 2025, Hasselt University

2025-04-10

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## bluesky: general aspects

- microblogging platform
- similar to twitter in user experience
- decentralized
- open source



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# Decentralization and Democratization of content algorithms <sup>1</sup>

- Decentralized User Identifier (DID)
  - immutable, associated with human readable user handle
- Personal Data servers (PSDs)
- DIDs and affiliated contents are portable between PSDs
- Users can choose, prioritize and develop feed generators and content labelers

<sup>&</sup>lt;sup>1</sup>Balduf et al. (2024)

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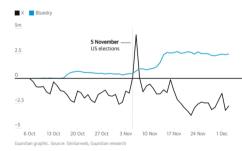
Data

Danilla

## Development of user activity <sup>2</sup>

- current estimate: ca. 33 Millions active users
- user base expanded in bursts after key events:
  - 2022: acquisition of twitter by Elon Musk
  - 2024: ban of X in Brazil, presidential election in the US

X has lost users since October while Bluesky has gained close to 2.5m Change in active daily users since 6 October 2024



<sup>&</sup>lt;sup>2</sup>Duarte, Balduf et al. (2024)

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## Literature addressing bluesky

- Google scholar search: "bluesky" AND "social" since 2022
- 43 articles
- main topics:
  - decentralized social network architecture
  - user migration from X to bluesky 2024
  - network structure and dynamics
- no results for
  - "bluesky" AND "disease"
  - "bluesky" AND "epidemiology"

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## bluesky API

- publicly accessible for free
- extensive documenation at https://docs.bsky.app/docs/category/http-reference

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### searchPosts API method

- API documentation
- selected parameters:
  - q: search query
  - since, until: defining search period
- deterministic search
- allows exhaustive sampling

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## getProfiles

- allows to retrieve the author profile information
- for reference, not used in this project

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### Post metadata

- defined in the SDK documentation
- fields (selection):
  - uri: unique post identifier
  - author: contains did which allows to retrieve user profile
  - record: contains the text and time information of the message
  - embedded: any embedded media (images, other posts, etc ...)
- in contrary to former twitter post metadata, no geoinformation

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### User information

- Feedgens
- Labelers
- no geo information

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## Outline

bluesky post data for digital disease surveillance

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### **Project**

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Outline

bluesky post data for digital disease surveillance
Implementation of a continuous surveillance pipeline

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## Data extraction

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## Symptom related message extraction

- focused on French bluesky posts (data volume constraint)
- extraction using list of keywords
  - grippe (flu, influenza)
  - rhume (common cold)
  - fievre (fever)
  - courbature (muscle pain)
- extraction of
  - complete message data for further language processing
  - •

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## Basal network activity

- probing of the basal network activity using keywords
  - travail (work)
  - demain (tomorrow)
  - voiture (car)
  - sommeil (sleep)
- post counts aggregated by day

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### Case data

- data downloaded from WHO Flumart = FluID: ILI case data
  - FluNet: virological data

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## Data processing for time series extraction

- Normalization of ILI post counts by basal network activity
- LLM
- ECDC case definition
  - LLM vs. random post selection

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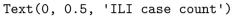
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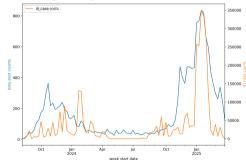
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## Raw post counts





### Correlation

	grippe_posts	rest_posts
grippe_posts	1.000000	0.884120
rest_posts	0.884120	1.000000
ili_case	0.769662	0.552405

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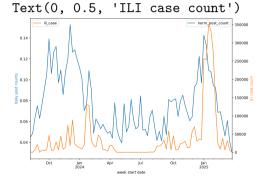
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## T . (0 0 5 1717 ...)



It is not as simple as that .... :/

## Normalized post counts

### Correlation

	norm_post_count	re
norm_post_count	1.000	0.
rest_posts	0.197	1.
ili_case	0.436	0.

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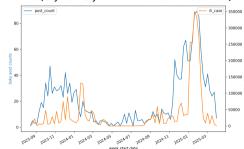
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## LLM annotated post counts, raw

Text(0, 0.5, 'ILI case count')



### Correlation

	ili_case	post_count
ili_case	1.00	0.71
post_count	0.71	1.00

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## **Bibliography**

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