



May27, 2025









### Agenda

- About at the Social Media Lab & Social Media Research Landscape
- 2. Overview of Communalytic
- 3. Topic Analysis with Embeddings

#### **About the Social Media Lab**



**★** @SocialMediaLab.ca





#### A Multidisciplinary Research Laboratory at TRSM

The lab's research seeks to advance the public's understanding of the benefits and pitfalls of social media adoption.







Philip Mai M.A., J.D.
Co-Director and Senior
Researcher









#### **Research Foci**





















## International Conference on Social Media & Society July 2026 | London, UK





2017

Online



2019



2010

2016

The Social Media Lab hosts a variety of research events throughout the year. These events allow participants to exchange ideas, learn new tools and methods, discover new research and network with peers.

2018

#SMSociety 8th International Conference on Social Media & Society 2020



2024

Online

14 Years Running 400+ Authors. 200+ Attendees from 25+ Countries every year

socialmedialab.ca/events/







# **Recent publication:** Exposure to and Belief in Pro-Kremlin Disinformation among Canadians

Soares, F. B., Gruzd, A., & Mai, P. (2023). Falling for Russian propaganda: Understanding the factors that contribute to belief in pro-Kremlin disinformation on social media. Social Media+ Society, 9(4), 20563051231220330.



#### **Key Findings**

- Exposure to disinformation on social media is positively correlated with belief in it.
- 2. Individuals who hold right-leaning ideology are more likely to believe in pro-Kremlin claims overall as compared to those who hold mixed or left-leaning views.
- 3. Those who believe in pro-Kremlin claims are more likely to rely on social media for news about the war than those who do not believe.

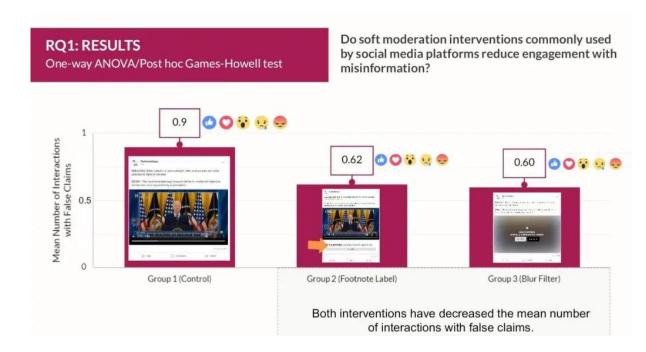


# **Recent publication:** Effectiveness of Warning Labels on Posts Containing False Claims about the Russia-Ukraine War

Gruzd, A., Mai, P., & Soares, F. B. (2024).

To Share or Not to Share: Randomized Controlled Study of Misinformation Warning Labels on Social Media. In Multidisciplinary International Symposium on Disinformation in Open Online Media (pp. 46-69). Cham: Springer Nature.





#### Recent publication: Pro-Kremlin discourse on Twitter



#### **Key Finding**

- 53% of the sample posts aligned with pro-Kremlin narratives against Ukraine.
- By exploiting anti-refugee sentiments and political/cultural fault lines in the West, pro-Kremlin messages contribute to
  - diminishing support for Ukrainian refugees,
  - minimizing the severity of the war, and
  - undermining international support for Ukraine.

#### **Data About Canadians For Canadians**

As part of our work, the Lab produces public reports that provide a snapshot of social media usage trends in Canada and a window into Canadians' attitudes and perspectives toward issues such as misinformation, politics, and privacy in the context of social media.

Our public reports are widely used by different stakeholders including parliamentary committees, government departments, journalists, researchers, educators, the business community and the general public.

State of Social Media in Canada

Misinformation Research

Social Media and User Privacy

Influencers

The Influence of

Social Media and Political **Engagement in** Canada

Social Media and Anti-Social Behaviour



















#### **Recent Reports:**

- The State of Anti-Social Behaviour on Social Media 2023
- The Influence of Influencers in Canada 2023
- The Reach of Russian Propaganda & Disinformation in Canada
- State of Social Media in Canada 2022





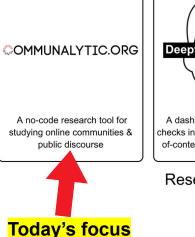


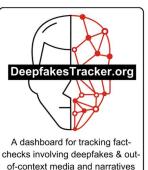
## Research Tools & Apps

In addition to conducting original research, we also develop tools and dashboards that support social science research and to track misinformation.

Our apps and tools are used by thousands of students, educators, researchers & analysts worldwide each year.





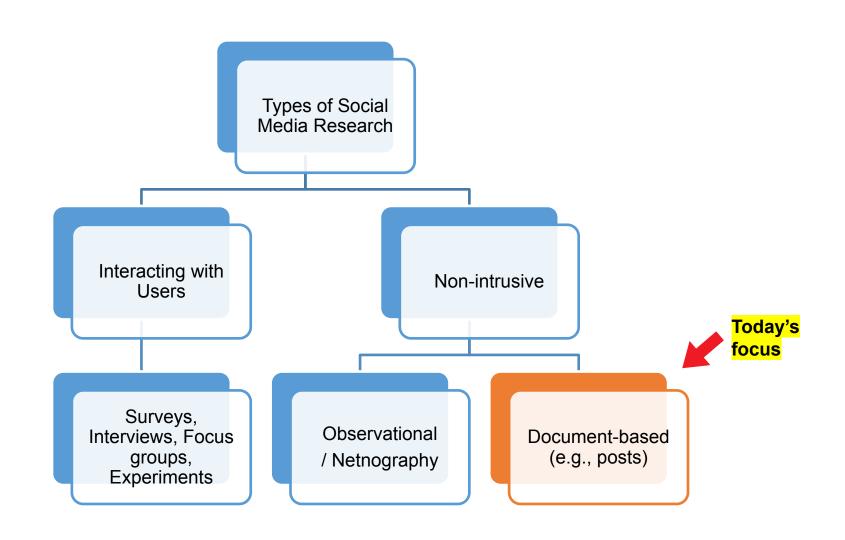




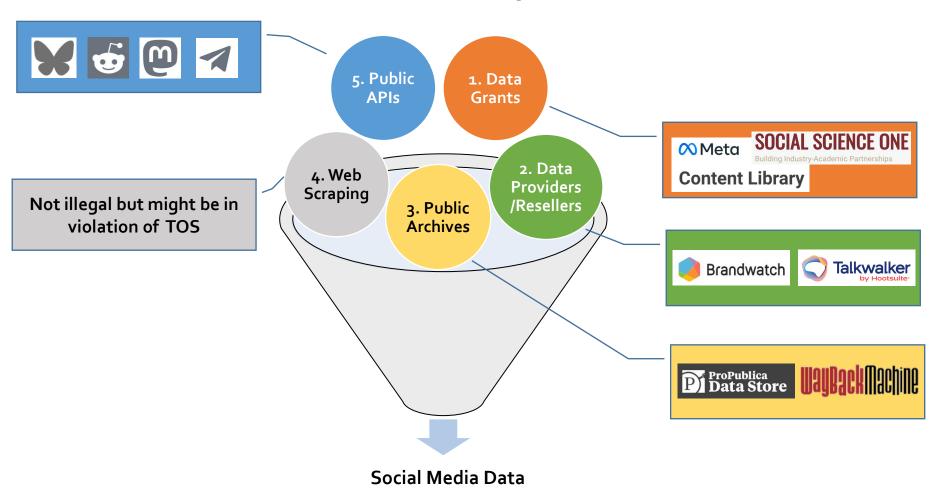


PoliDashboard.org

Research Apps, Tools, and Dashboards socialmedialab.ca/apps



#### Different Options of Collecting Social Media Data



## Social Media Analytics Stages



#### **Ethical Considerations**

- Social Media Research Ethics → not a "one size fits all" framework
- Privacy varies across uses, users, and data types
  - Academic researchers > Employer >
     Financial Companies, Government bodies,
     Marketers
  - Aggregated > Raw > Social Network Data

(Social Media Lab)

- Research more 'acceptable' if:
  - "it's going to a good cause"
  - "general public good"
- Social media users care about data quality, accuracy, representation.
- Special consideration when studying sensitive topics and vulnerable groups (e.g., minors, the deceased, mental health).

(Golder et al. 2017)





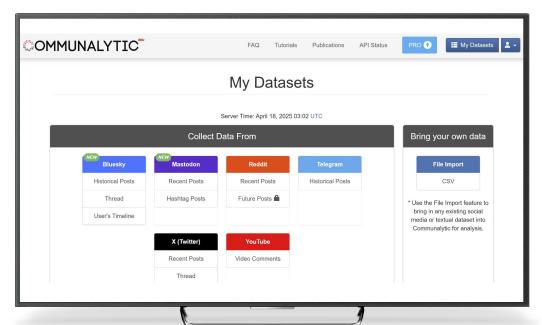


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- 2. Overview of Communalytic
- 3. Topic Analysis with Embeddings

## **Research Tool: Communalytic**

A research tool developed by TMU's Social Media Lab for studying online communities and discourse





Communalytic can collect, analyze, and visualize public data from social media (e.g. Reddit, Bluesky, Mastodon, Telegram, or CSV files.

https://communalytic.org

## COMMUNALYTIC

A no-code computational social science research tool for studying online communities and public discourse. It is designed to provide researchers, journalists and students with essential resources and infrastructure for conducting independent, public-interest research. **Users can bring their own data or use one of Communalytic's various social media data collectors**.

#### **2 Versions of Communalytic**

For Teaching & Learning | 30K Records across 3 Datasets

For Research | 3M Records across 30 Datasets

Designed to help students learn about social media data analytics.

Designed for researchers and journalists and is ideal for large-scale research projects.

EDU Sign Up - It's Free!

**→3** EDU Login

PRO Sign Up - Free 7-Day Trial

→ PRO Login

https://communalytic.org/



#### **Account Types and Features**



#### **Account Types**

[EDU] - Free [PRO] - New for 2025:

We now offer more subscription options\* and lower prices, starting at just \$19.99 USD per month.



#### **Data Storage Cap**

**[EDU]** – Collect ≤ 30K records (shared across ≤3 datasets)

[PRO] – Collect ≤ 3M records (shared across ≤30 datasets)



#### **Sign-in Options**

[EDU] – via Gmail

[PRO] – via Gmail OR Regular email



## Concurrent Data Collection

Collect data from multiple social media platforms at the same time



#### Collaboration Friendly

Access to various team collaboration features

https://communalytic.org/



#### **Data Analyzers**

Communalytic also comes with a comprehensive suite of built-in data analyzers capable of processing both social and non-social media data. Many of the analyzers are equipped with advanced AI features that assist researchers in conducting complex analyses, offering valuable insights and recommendations as needed. Researchers maintain complete control throughout the process, allowing them to add essential context and expertise and make all final decisions.



#### **Civility Analyzer**

Identifies toxic and prosocial interactions in a dataset using the latest machine-learning models



#### **Sentiment Analyzer**

Calculates sentiment polarity scores to determine whether text in a dataset expresses a positive, negative or neutral sentiment





#### **Topic Analyzer**

Discovers latent topics based on the semantic similarity between posts (aka records) in a dataset using embeddings and multilingual large language models



#### **Network Analyzer**

Generates and visualizes various types of networks in a dataset, including communication and link-sharing networks

## Use a Gmail email account to sign up or log into Communalytic EDU

For Teaching & Learning | 30K Records across 3 Datasets

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Designed for researchers and journalists and is ideal for large-scale research projects.

PRO Sign Up - Free 7-Day Trial → PRO Login

## COMMUNALYTIC

#### **Social Media Data Collectors**

Communalytic is designed to provide researchers and journalists with the resources and infrastructure necessary for conducting independent research in the public interest. Users can bring their own data or use one of Communalytic's various social media data collectors. \*





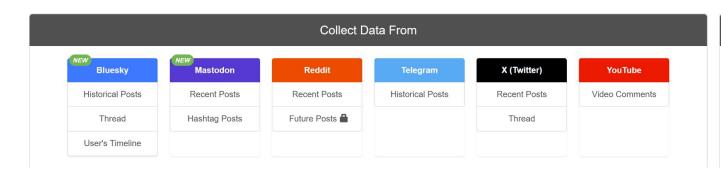








https://communalytic.org/



#### Bring your own data

File Import

\* Use the File Import feature to bring in any existing social media or textual dataset into Communalytic for analysis.







### Agenda

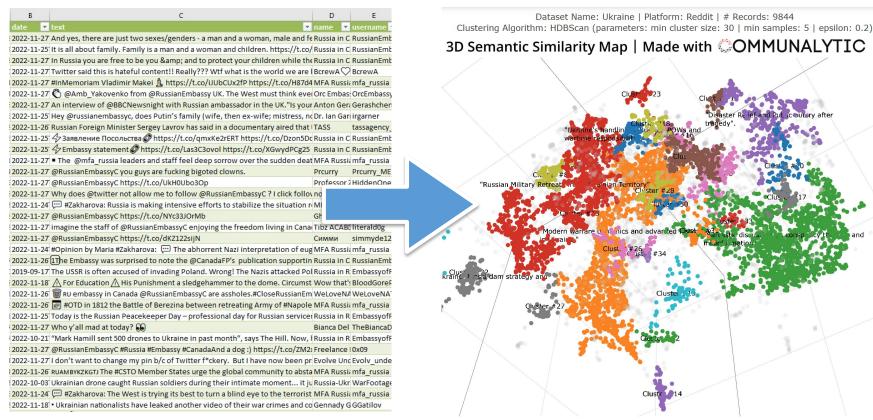
- 1. About at the Social Media Lab & Social Media Research Landscape
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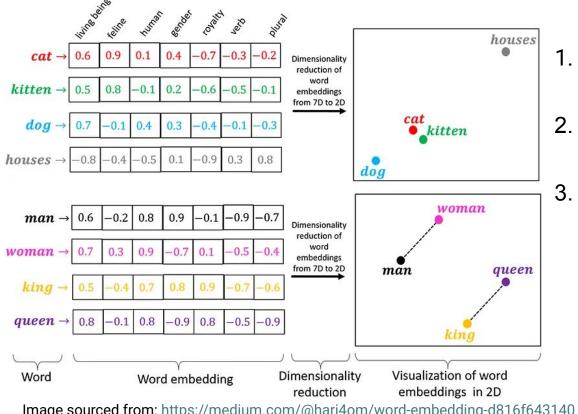
## **Topic Analysis with Text Embeddings**

#### 1. Represent & Project Posts into a Semantic Space

#### 2. Explore Latent Topics



## What are text embeddings? **Example of word embeddings:**



- Define "dimensions" and set values per word **or** sentence.
- Reduce the # of dimensions to visualize them in 2D or 3D.
- The closer dots (word or sentences) are in the visualization, the closer they are semantically.

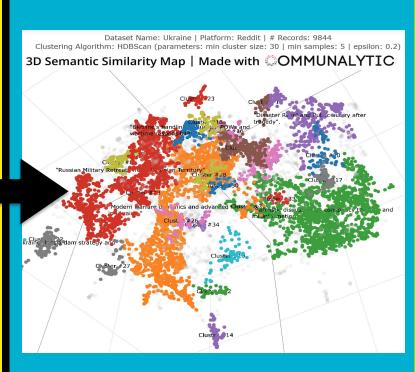
## What are text embeddings? Example of sentence embeddings:

Thank you!	<b>→</b>	-0.061	-0.037	-0.002	-0.120	-0.025	-0.007	0.006	-0.004	-0.085	
Wow! Thanks for your valuable feedback.	<b>*</b>	0.011	0.003	0.013	-0.047	-0.032	0.014	-0.082	-0.081	0.000	
Thank you for the advice. I will try that too :-)	<b>*</b>	0.023	-0.092	0.017	-0.038	-0.010	0.026	-0.164	-0.081	-0.028	

N dimensions (columns)

## Main Steps of Communalytic's Topic Analyzer

В	C	D	E
date 🔻	text	name 📑	username
	And yes, there are just two sexes/genders - a man and a woman, male and fe		
	It is all about family. Family is a man and a woman and children. https://t.co/		
	In Russia you are free to be you & and to protect your children while the		
	Twitter said this is hateful content!! Really??? Wtf what is the world we are I		
	#InMemoriam Vladimir Makei 🧘 https://t.co/iJUbCUx2fP https://t.co/H87d4		
	🖔 @Amb_Yakovenko from @RussianEmbassy UK. The West must think ever		
	An interview of @BBCNewsnight with Russian ambassador in the UK."Is your		
	Hey @russianembassyc, does Putin's family (wife, then ex-wife; mistress, no		ri irgarner
	Russian Foreign Minister Sergey Lavrov has said in a documentary aired that		tassagency
	4 Заявление Посольства € https://t.co/qmxKe2rERT https://t.co/Dzon5Dc		
	4 Embassy statement https://t.co/Las3C3ovol https://t.co/XGwydPCg25		
	■ The @mfa_russia leaders and staff feel deep sorrow over the sudden deat		
	- 1101 00	Prcurry	Prcurry_ME
			HiddenOne
	Why does @twitter not allow me to follow @RussianEmbassyC? I click follow		notabotada
	📁 #Zakharova: Russia is making intensive efforts to stabilize the situation re	MFA Russ	ii mf
	-	Ghee GBU	
	imagine the staff of @RussianEmbassyC enjoying the freedom living in Cana-	Tibz ACAE	1000
		Симми	simmyde12
	#Opinion by Maria #Zakharova: 💬 The abhorrent Nazi interpretation of eug		
	11 he Embassy was surprised to note the @CanadaFP's publication supportin		
	The USSR is often accused of invading Poland. Wrong! The Nazis attacked Pol		
	for Education A His Punishment a sledgehammer to the dome. Circumst		
	RU embassy in Canada @RussianEmbassyC are assholes.#CloseRussianEm		
	#OTD in 1812 the Battle of Berezina between retreating Army of #Napole		
	Today is the Russian Peacekeeper Day – professional day for Russian servicer	Russia in	R Embassyof
	7 00		I TheBiancaD
	"Mark Hamill sent 500 drones to Ukraine in past month", says The Hill. Now, I		
	@RussianEmbassyC #Russia #Embassy #CanadaAnd a dog :) https://t.co/ZM2		
	I don't want to change my pin b/c of Twitter f*ckery. But I have now been pr		
	RUAMBYKZKGTJ The #CSTO Member States urge the global community to absta		
	Ukrainian drone caught Russian soldiers during their intimate moment it ju		
	#Zakharova: The West is trying its best to turn a blind eye to the terrorist		
2022-11-18	<ul> <li>Ukrainian nationalists have leaked another video of their war crimes and co</li> </ul>	Gennady	G GGatilov



## 1. Pre-processing posts

- Excluding empty and posts shorter than 3 words;
- Posts over 300 words are truncated.

## 2. Representing posts as vector embeddings

 Representing posts as vector embeddings with a multilingual embedding model

Thank you!	
	ı
THAIR VUU	Į

Wow! Thanks for your valuable feedback.

Thank you for the advice.
I will try that too :-)

-0.061	-0.037	-0.002	
0.011	0.003	0.013	
0.023	-0.092	0.017	

N dimensions

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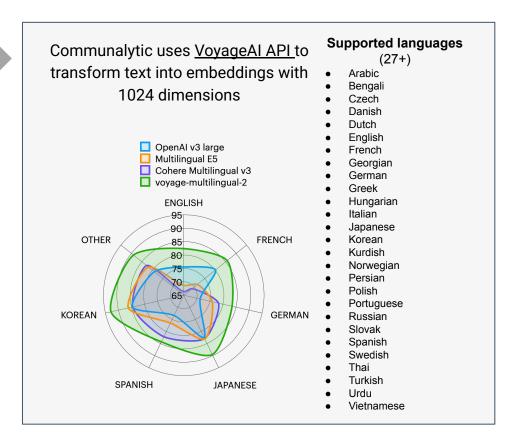
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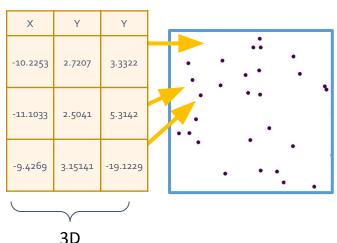
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N dimensions

## 3. Projecting embeddings into a 3D space

 Reducing dimensions of embeddings to 3 for visualization purposes



Pre-processing posts

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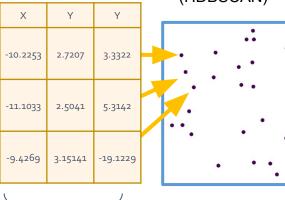
2. Representing posts as vector embeddings

 Representing posts as vector embeddings with a multilingual embedding model (VoyageAl API)

-0.061	-0.037	-0.002	
0.011	0.003	0.013	
0.023	-0.092	0.017	

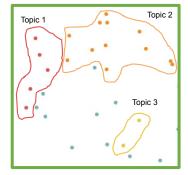
3. Projecting embeddings into a 3D space

 Reducing dimensions of embeddings to 3 for visualization purposes (UMAP)



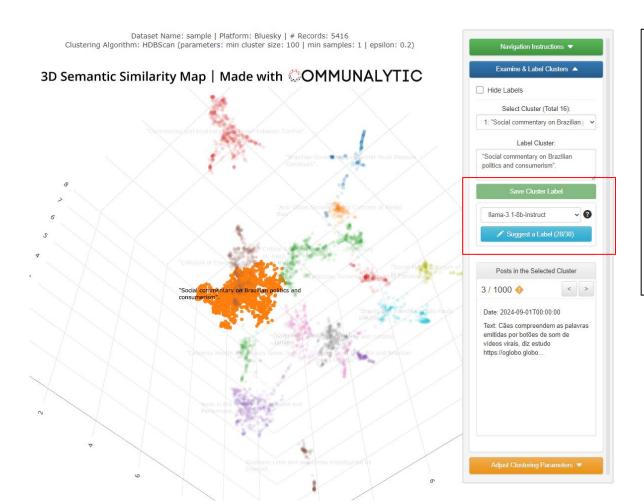
4. Clustering posts based on semantic similarity

- Grouping posts located close to each other in a 3D space based on a clustering algorithm (HDBSCAN)
- 5. Visualizing posts via a 3D interactive map
- Displaying posts in a 3D space using an interactive web-based visualization
- Review and label clusters based suggestions from an LLM (Llama 3)



N dimensions

3D



## Semi-Automated Labeling of Clusters

Auto-Labeling with a Large Language Model

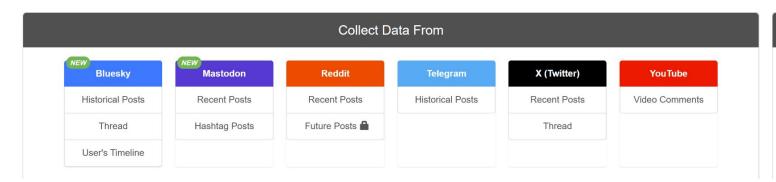
- Automatically labels each cluster
- Synthesizes short topical descriptions for each topic/cluster

### **Hands-on Exercise**:



Posts mentioning "**Azerbaijan**" on Bluesky, following the crash of Azerbaijan Airlines Flight 8243 on December 25, 2024

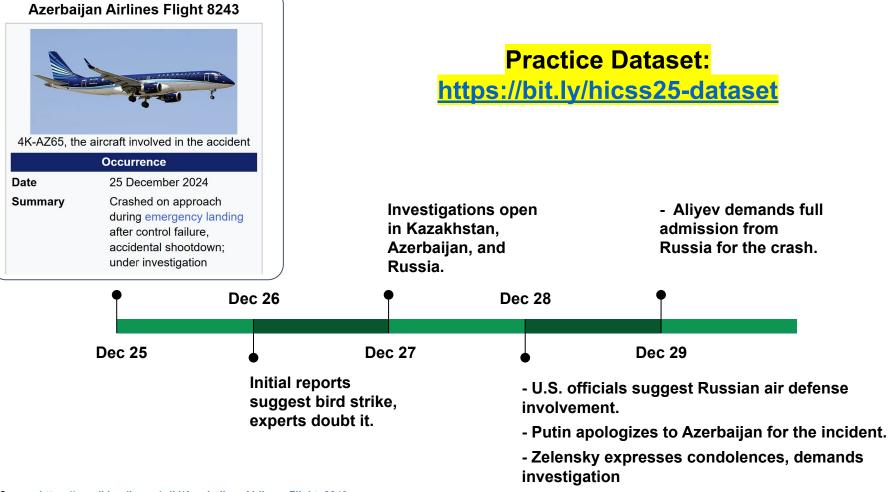
**Step 1:** Download a zipped CSV file: <a href="https://bit.ly/hicss25-dataset">https://bit.ly/hicss25-dataset</a> and import it into Communalytic



File Import

CSV

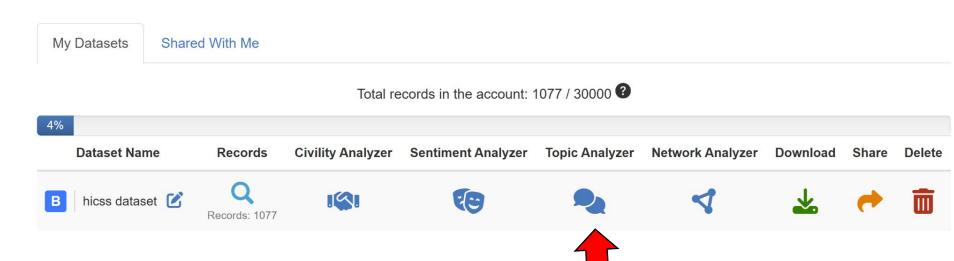
\* Use the File Import feature to bring in any existing social media or textual dataset into Communalytic for analysis.



Source: https://en.wikipedia.org/wiki/Azerbaijan Airlines Flight 8243



### Step 2: Click on the Topic Analysis icon



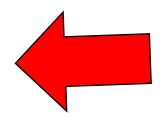
### **Step 3: Click Visualize Embeddings**



Clustering Pa	rameters <b>☑</b>	
	Epsilo	n: 🕜
	0.1	~
Select a Clustering Algorithm:	Minimum Clus	ster Size: <b>?</b>
Fast HDBScan V	10	~
Tactribbecan	Minimum Sam	nple Size: 🔞
	10	~

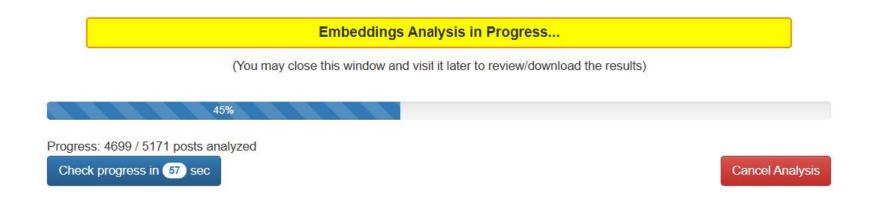
Check to be notified when visualization is ready.





### **Step 4: Wait**





### **Step 5: Click Open Visualization**

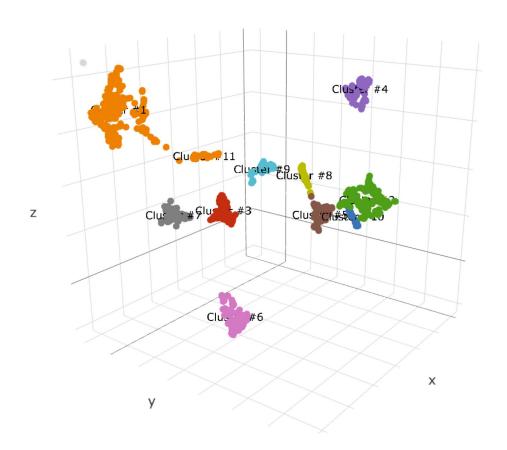
#### Topic Analysis Module (Experimental)

The Topic Analysis Module automatically identifies and groups together social media posts that are semantically similar and can be used to spot latent topics in a dataset (i.e., abstract topics that may not be directly observable from just reading the posts). The module transforms human-readable textual data such as social media posts into computer-readable vectors of numbers known as embeddings. To get start, please review this tutorial.

Learn more... 🖸



### **Step 6: Explore the 3D Semantic Similarity Map**

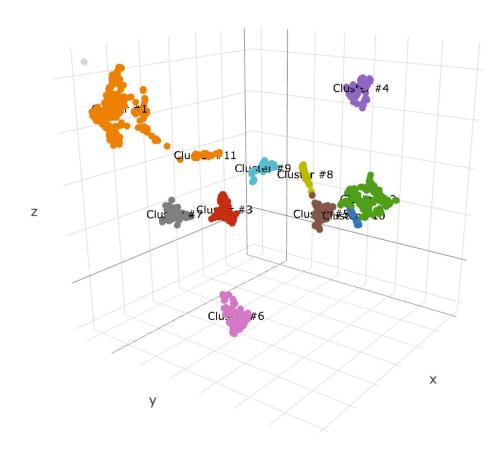


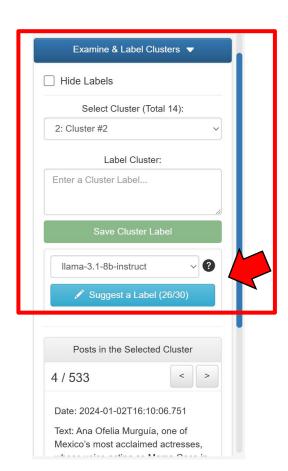
#### 



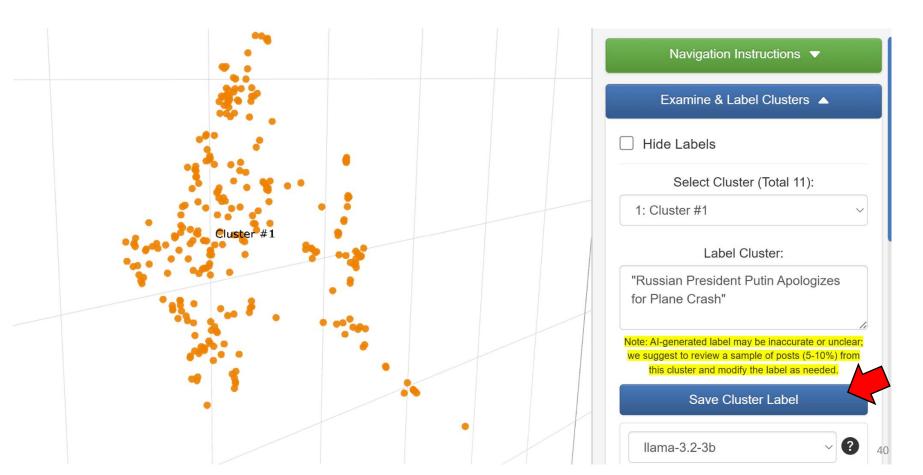
- Use the drop down menu in the "Examine & Label Clusters" panel to select and zoom in on a specific cluster.
- Click the icon at the top right corner to see where the selected cluster is located within the 3D Map.
- Left click mouse and move to rotate the camera.
- Right click mouse and move to pan the camera.
- Scroll mouse wheel to zoom in and out.
- Hover on dot to preview post.

### **Step 7: Review & Label Clusters**





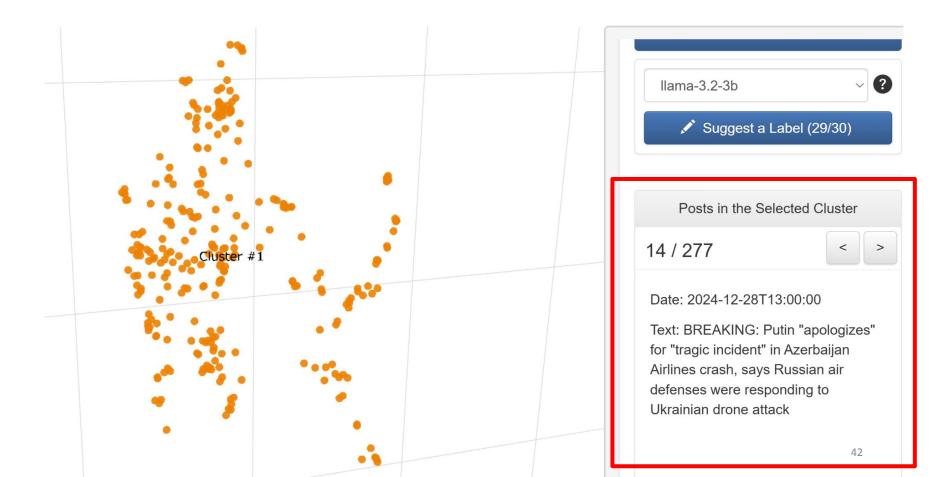
### **Step 7: Review & Label Clusters**



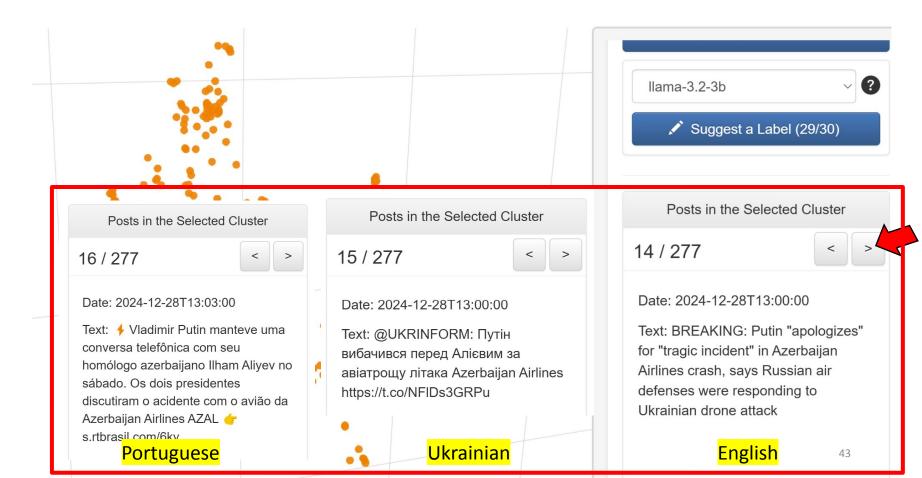
### **Step 7: Review & Label Clusters**



### Step 8: Cross-validate each Al-suggested label



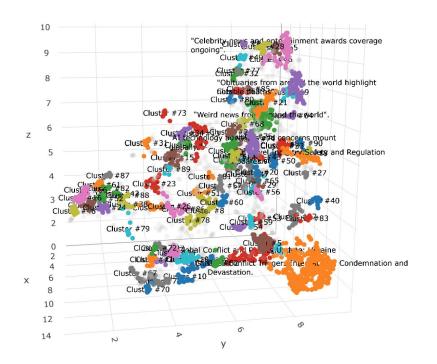
## Step 8: Cross-validate each Al-suggested label

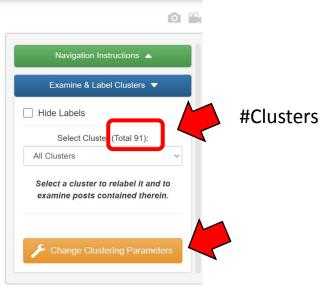


# Step 9: Change clustering parameters to reduce/increase the number of clusters (Optional)

Dataset Name: test | Platform: Bluesky | # Records: 4293 Clustering Algorithm: HDBScan (parameters: min cluster size: 10 | min samples: 10 | epsilon: 0.05)

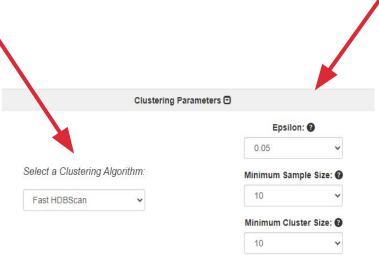
3D Semantic Similarity Map | Made with OMMUNALYTIC





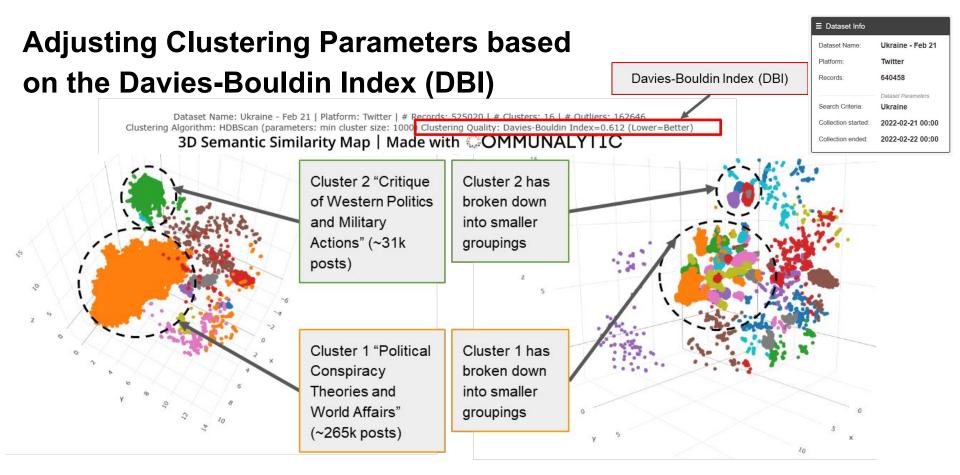
Supported Clustering Algorithms

- Fast HDBScan (the default) is best for data with varying densities and outliers but requires parameter tuning.
- KMeans is efficient and easy to use but assumes spherical clusters and is sensitive to outliers.
- Gaussian Mixture offers flexibility in cluster shapes with probabilistic memberships but assumes Gaussian distributions.



## HDBScan Parameters

- Epsilon controls the distance for neighborhood consideration, impacting how close points need to be to form a cluster.
- Minimum Sample Size determines the density requirement for a point to be considered a core point and thus part of a cluster.
- Minimum Cluster Size sets a threshold for the minimum number of posts required to form a cluster.



Minimum Cluster Size = 1000

Minimum Cluster Size = 500





May 27, 2025

