PAN Task on Oppositional thinking analysis: Conspiracy theories vs critical thinking narratives

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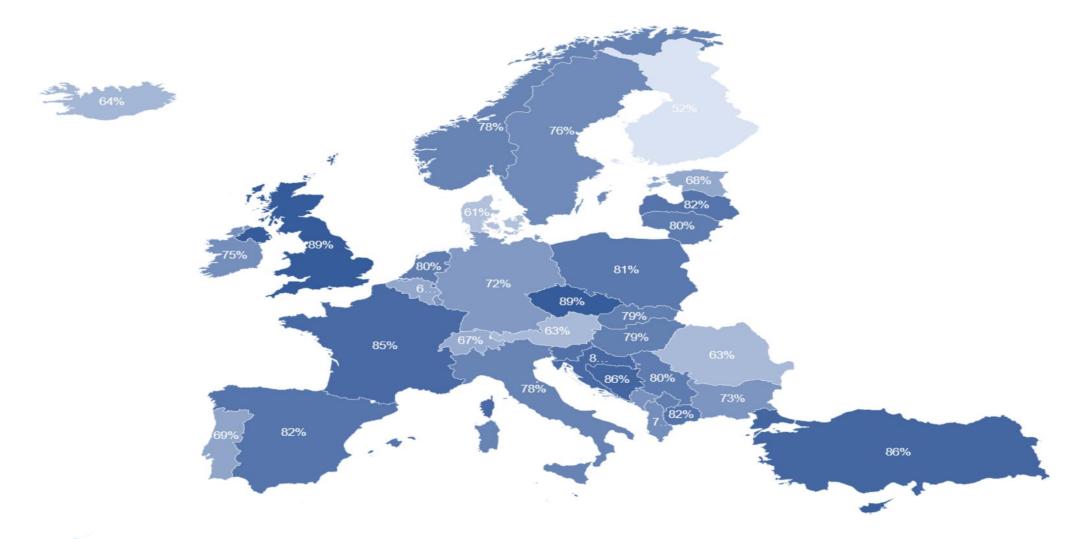




Information warfare: Foreign information manipulation interference

- European External Action Service (EEAS)
- Early detection of Tactics, Techniques, and Procedures (TTP)
- Indicators: harmful, not illegal, manipulative, intentional, coordinated
- Action plan for the European democracy by the EC (December 2020): aim is to fight against disinformation
- DISARM Framework: aim is the standardization of the model of the analysis of the behaviours in disinformation attacks (detection, analysis, answers)
- Threats of manipulation of information and interference from foreign agents
- Monitoring 616 channels: 40% linked to Russian and Chinese media (Russian's attempt to create polarization in Western democracies)

The perception of disinformation as a problem in Europe



Badillo-Matos A. et al. (2023). **Analysis of the Impact of Disinformation on Political, Economic, Social and Security Issues, Governance Models and Good Practices: The cases of Spain and Portugal**. IBERIFIER, Pamplona.



European Digital Media Observatory

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National and multinational hubs



COORDINATOR Universidad **PARTNERS** Barcelona Supercomputing Center Centro Nacional de Supe Associação Literacia CEU | Universidad San Pablo efeverifica: REAL INSTITUTO elcano FECT ISCLE INSTITUTO UNIVERSITÁRIO DE LISBOA LUSA 🇖 MALDITA.ES Ne //tral OberCom MESTANÇÃO E SABER EM COMUNICAÇÃO Poligrafo Politécnico de Viseu Miguel Hernández UNIVERSITAT POLITECNICA UNIVERSIDAD DEGRANADA **VNIVERSITAT** verificat D VALÈNCIA

EDMO Task Force on 2024 EU Elections

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Several false narratives about climate change are on the scene. In recent days, a remarkable assortment of false narratives about climate change has resurfaced in various countries. False stories range from <u>usual denialism</u> to conspiracy theories (e.g. <u>chemtrails</u>), from painting <u>measures</u> to address the climate crisis as unfair to attacking <u>climate activists</u>, politicians and <u>supporters</u> as hypocrites or <u>Nazis</u>. These false stories were detected in: PL, DE, HR, EL, ES.

Conspiracy theories



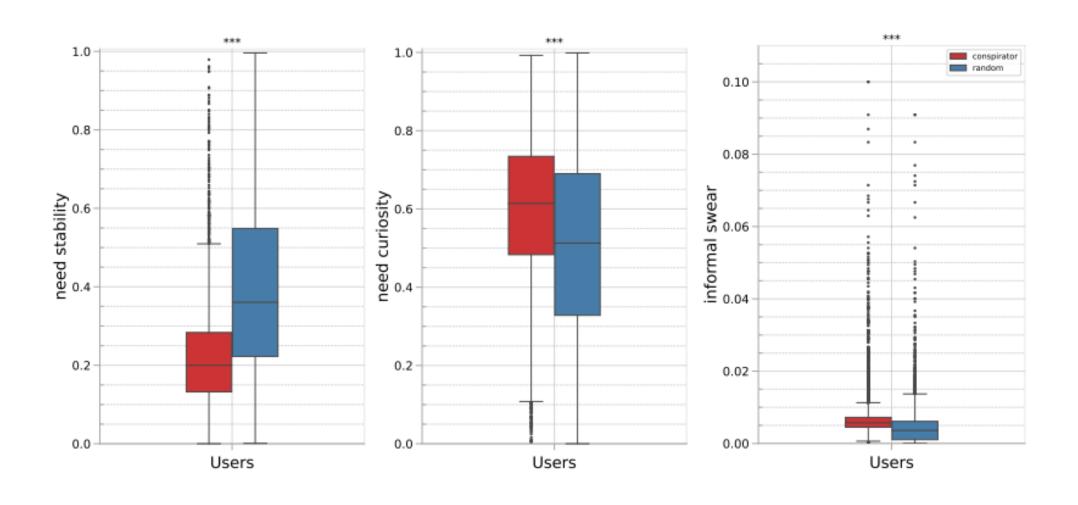
Conspiracy theories

- Causal explanations of significant events that present them as a result of cover plots orchestrated by secret powerful and malicious groups
- Greater use of violent words and the emotional manifestation of anger
- COVID-19
- Qanon (satanism and pedophilia)
- Green tyranny (cut rights and freedoms)
- Great replacement (Christian by Muslims)
- Great reset (plan of control of the population)
- Secret Jewish plan
- In 2M Reddit comments only 5% users were conspiracy theorists but they wrote 64% of comments: the most active user wrote 896k words = the doble of The Lord of the Rings (UNESCO, 2020)

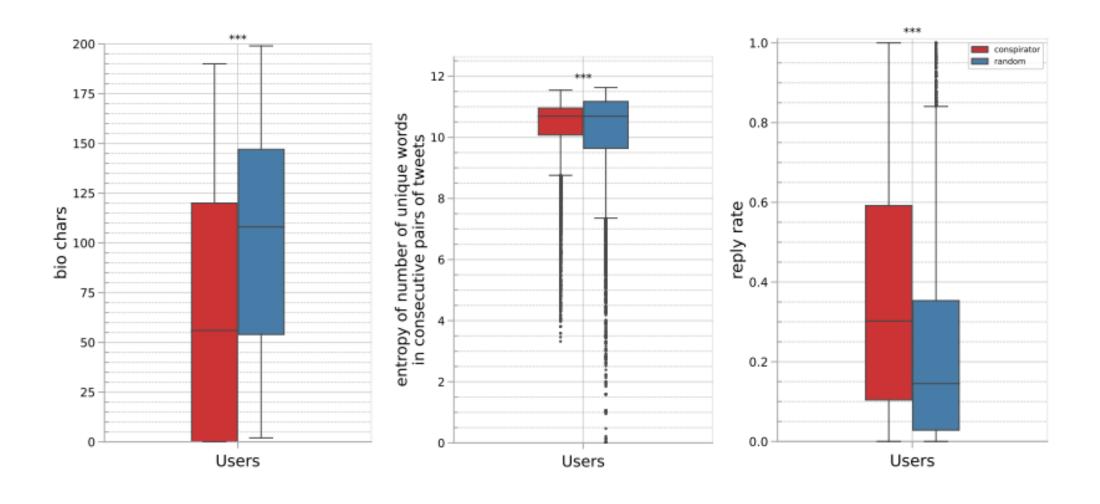
Psycholinguistics features

- **Emotions**: Plutchik's 8 emotional categories (anger, anticipation, disgust, fear, joy, sadness, surprise, and trust)
- Sentiment (polarity: positive, negative)
- Personality traits via IBM Personality Insights: Big 5 Traits (OCEAN), 5
 Values (conservation, hedonism, openness to change, self-enhancement, self-transcendence), and 12 Needs (challenge, closeness, curiosity, excitement, harmony, ideal, liberty, love, practicality, self-expression, stability, structure)
- Linguistic patterns via LIWC tool (pronouns, personal concerns, time focus, cognitive processes, informal language, affective processes)

Psycholinguistics features



Other features



Tackling COVID-19 conspiracy on Twitter

- Shared task at MediaEval 2022
- Twitter data: scraping, keyword-filtering, cleaning, annotation
- User graph: nodes are users, edges are user-user interactions
- Text-based detection of conspiracy theories (task 1)
- Graph-based conspiracy spreader detection (task 2)
- Conspiracy categories: suppressed cures, behaviour and mind control, antivax, fake virus, intentional pandemic, harmful radiation or influence, population reduction, new world order, and satanism
- Text-conspiracy relation: support, mention, no-mention

Taxonomies on conspiracy theories

• Focus:

- outsiders vs insiders (exogroup vs endogroup) as friend/enemy schema
- Social Identity Theory that gives to the individual a social identity and a sense of belonging

Drawbacks:

- it mixes **actions** and **actors**, i.e. groups of people (**social categories**): an event (e.g. AIDS) may provoke the *action* of a *social group*
- actors with consequences and objectives (labelled the three of them with just one label: insiders)
- mixing actors and actions cannot capture an intergroupal conflict, just friend/enemy schema

Holur P., Wang T., Shahsavari S., Tangherlini T., Roychowdhury V. (2022). Which Side are you On? Insider-Outsider Classification in Conspiracy-theoretic Social Media. Proc. of the 60th Annual Meeting of the Association for Computational Linguistics, pp. 4975 - 4987

Conspiracy narrative vs critical thinking

- Importance of not confuse critical and conspiracy narratives: high risk of pushing people towards conspiracy communities
- Social psychologist on board and linguists for the annotation
- "Us vs them" narrative
- Insiders include campaigners and victims
- Outsiders include agents and facilitators
- Categories at span level
- **Domain-agnostic**: it could be applied to other conspiracy theories (e.g. climate change)

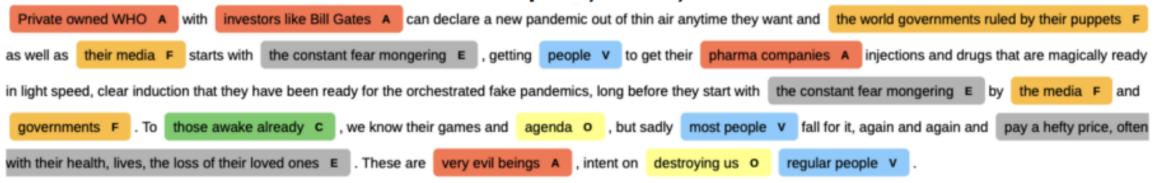
Conspiracy narrative vs critical thinking

- Agents (A)
- Objectives (O)
- Consequences (E)
- Victims (V)
- Campaigners (C): those who oppose the mainstream narrative
- Facilitators (F): collaborators with conspiracy propagators (conspiracy narrative) vs implementing measures dictated by the authorities (critical thinking)

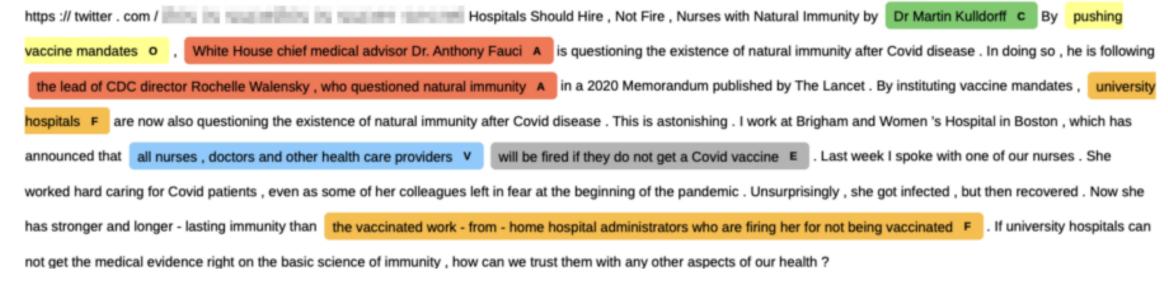
XAI: eXplainable AI

Oppositional narrative

Conspiracy Theory



Critical Thinking



Oppositional thinking analysis: Conspiracy theories vs critical thinking narratives

- XAI-DisInformation dataset: 10k messages of Telegram i
- Oppositional non-mainstream views on the COVID-19 pandemic

- 1st task: conspiracy theories vs critical thinking narratives (Matthew's correlation coefficient)
- 2nd task: text-span recognition of elements of oppositional narratives (macro-averaged span-F1)
- 82 teams participated









XAI-DisInfodemics:

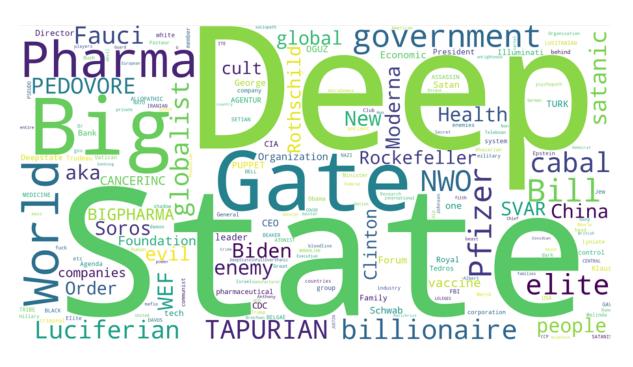
eXplainable AI for disinformation and conspiracy detection during infodemics (PLEC2021-007681)

Korenčić D., Chulvi B., Bonet X., Taulé M., Rosso P., Rangel F. (2024).

Overview of the Oppositional Thinking Analysis PAN Task at CLEF 2024.

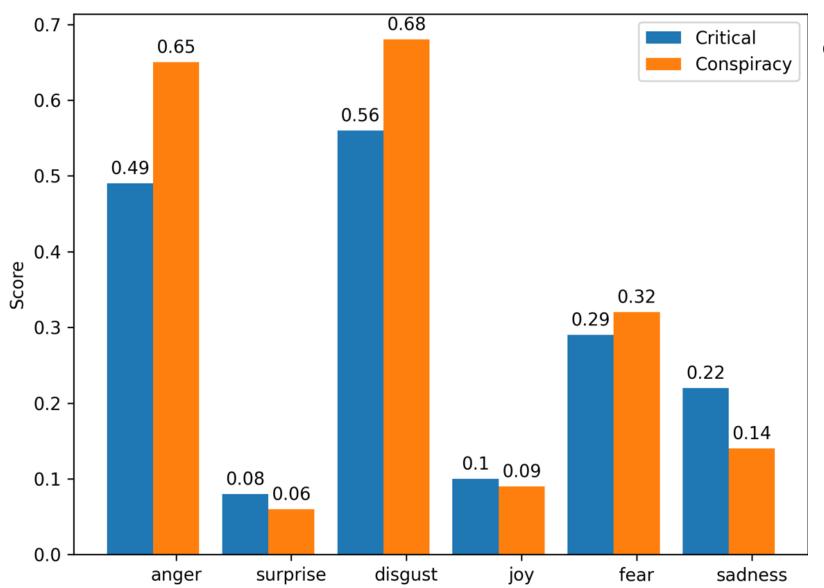
Working Notes of CLEF 2024 – Conference and Labs of the Evaluation Forum.

Conspiracy theorists vs critical thinkers: agents





Conspiracy theorists vs critical thinkers: emotions



cardiffnlp/twitter-roberta-base-emotion-latest

Higher use of hurtful words by conspiracy theorists (HurtLex)

Bassignana E., Basile V., Patti V. (2018). **Hurtlex: A Multilingual Lexicon of Words to Hurt**. In Proc. of the Fifth Italian Conf. on Computational Linguistics (CLiC-It 2018)

Results (above transformer baselines): task 1

English		Spanish	
TEAM	мсс	TEAM	MCC
IUCL [56]	0.8388	SINAI [41]	0.7429
Al_Fusion	0.8303	auxR	0.7205
SINAI [41]	0.8297	RD-IA-FUN [40]	0.7028
ezio [44]	0.8212	Elias&Sergio	0.6971
hinlole [53]	0.8198	Al_Fusion	0.6872
Zleon [48]	0.8195	zhengqiaozeng [52]	0.6871
virmel	0.8192	virmel	0.6854
inaki [47]	0.8149	trustno1	0.6848
yeste	0.8124	Zleon [48]	0.6826
auxR	0.8088	ojo-bes	0.6817
Elias&Sergio	0.8034	tulbure [54]	0.6722
theateam	0.8031	sail [50]	0.6719
trustno1	0.7983	nlpln [55]	0.6681
→ DSVS [46]	0.7970	baseline-BETO	0.6681
ojo-bes	0.7969		
sail [50]	0.7969		
RD-IA-FUN [40]	0.7965		
baseline-BERT	0.7964		

- IUCL: DeBERTa fine-tuned with a subset of 16k of the LOCO dataset
- **SINAI**: fine-tuned GPT-3.5 turbo (ES), fine-tuned LLaMA (EN)
- **DSVS**: Ensemble of Transformers
- **TU-Berlin**: LLM-generated text's context and argumentation

Miani A., Hills T., Bangerter A. (2021). LOCO: The 88-million-word Language Of Conspiracy Corpus, Behavior research methods, pp. 1–24.

Results (above transformer baselines): task 2

English		Spanish	
TEAM	span-F1	TEAM	span-F1
tulbure [54]	0.6279	tulbure [54]	0.6129
Zleon [48]	0.6089	Zleon [48]	0.5875
hinlole [53]	0.5886	AI_Fusion	0.5777
oppositional_opposition	0.5866	virmel	0.5616
Al_Fusion	0.5805	CHEEXIST	0.5621
virmel	0.5742	miqarn	0.5603
miqarn	0.5739	DSVS [46]	0.5529
TargaMarhuenda	0.5701	TargaMarhuenda	0.5364
ezio [44]	0.5694	Elias&Sergio	0.5151
zhengqiaozeng [52]	0.5666	hinlole [53]	0.4994
Elias&Sergio	0.5627	baseline-BETO	0.4934
DSVS [46]	0.5598		
CHEEXIST	0.5524		
rfenthusiasts	0.5479		
ALC-UPV-JD-2	0.5377		
baseline-BERT	0.5323		

- tulbure: RoBERTa + data augmentation replacing words in the text-spans by synonyms or semantically-related words
- **Zleon:** several transformers + multi-task learning

Brandolini's law, aka the bullshit asymmetry principle (2013):

The amount of energy needed to refute something stupid is greater than that needed to generate it.

(but we have to do it, manually or with the help of AI LLMs)