



INSTITUT  
POLYTECHNIQUE  
DE PARIS



# Data and AI for trustworthy digital democracy

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# Overview of our research

## Big Data Management and Analytics



## Models, methods and tools for digital democracy

## Natural language processing



# Challenges in data journalism

Digital data sources are **heterogeneous**



- ☐ Acquisition driven by *interest* and *opportunity*, not quality/model/schema/platform etc.
- ☐ No time / means to design an integrated schema  
Also: data sets are dynamic; application need may vary
- ☐ Non-technical users, no system literacy
- ☐ Datasets often features **common actors, concepts** of interest to the journalist



# Digital arenas

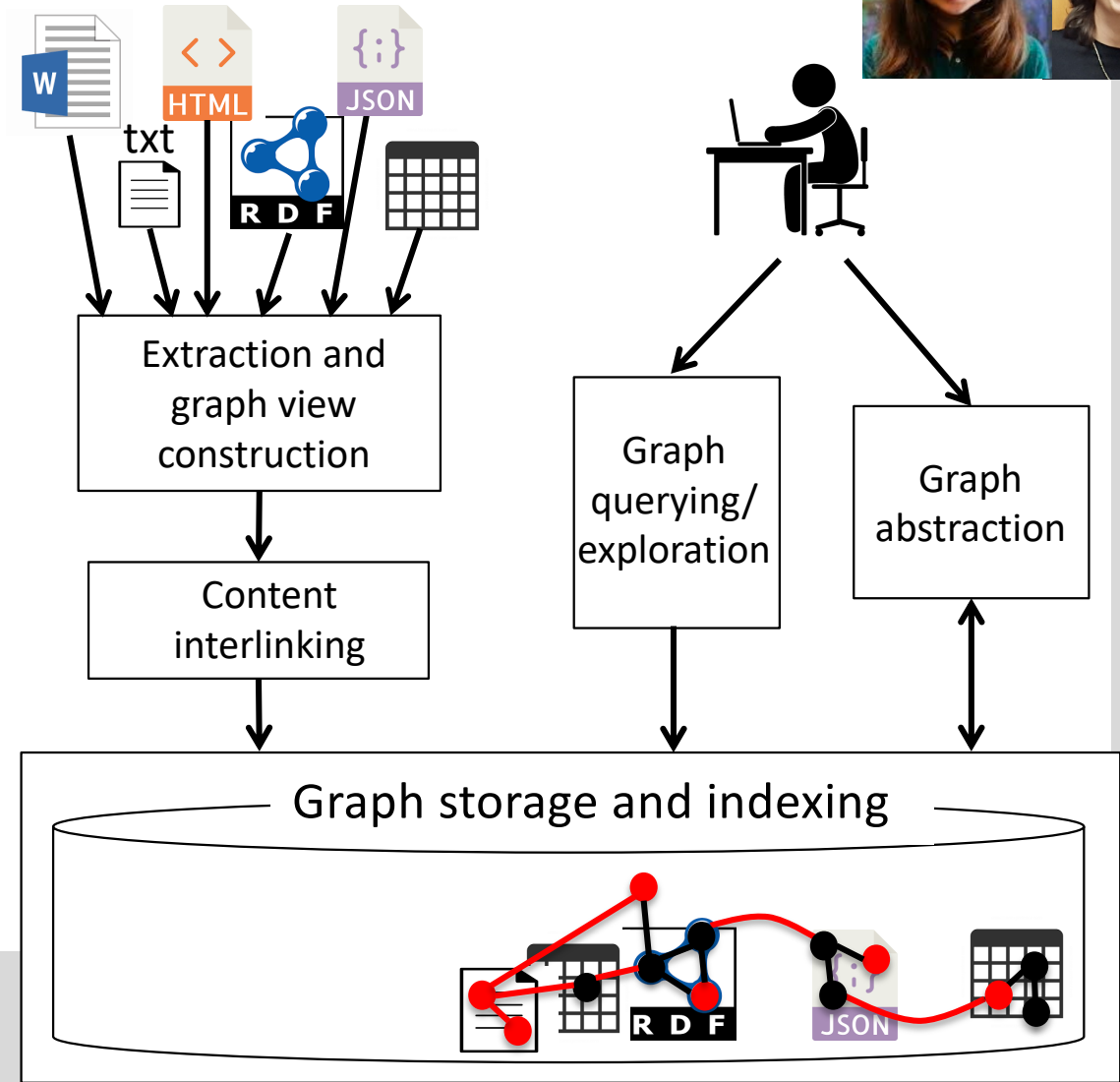
- ❑ Integrate **any** data in a **graph**
- ❑ Based on common **entities**, and **relationships extracted**
- ❑ **Querying** for **connections** between heterogeneous data sources (keywords+structure)

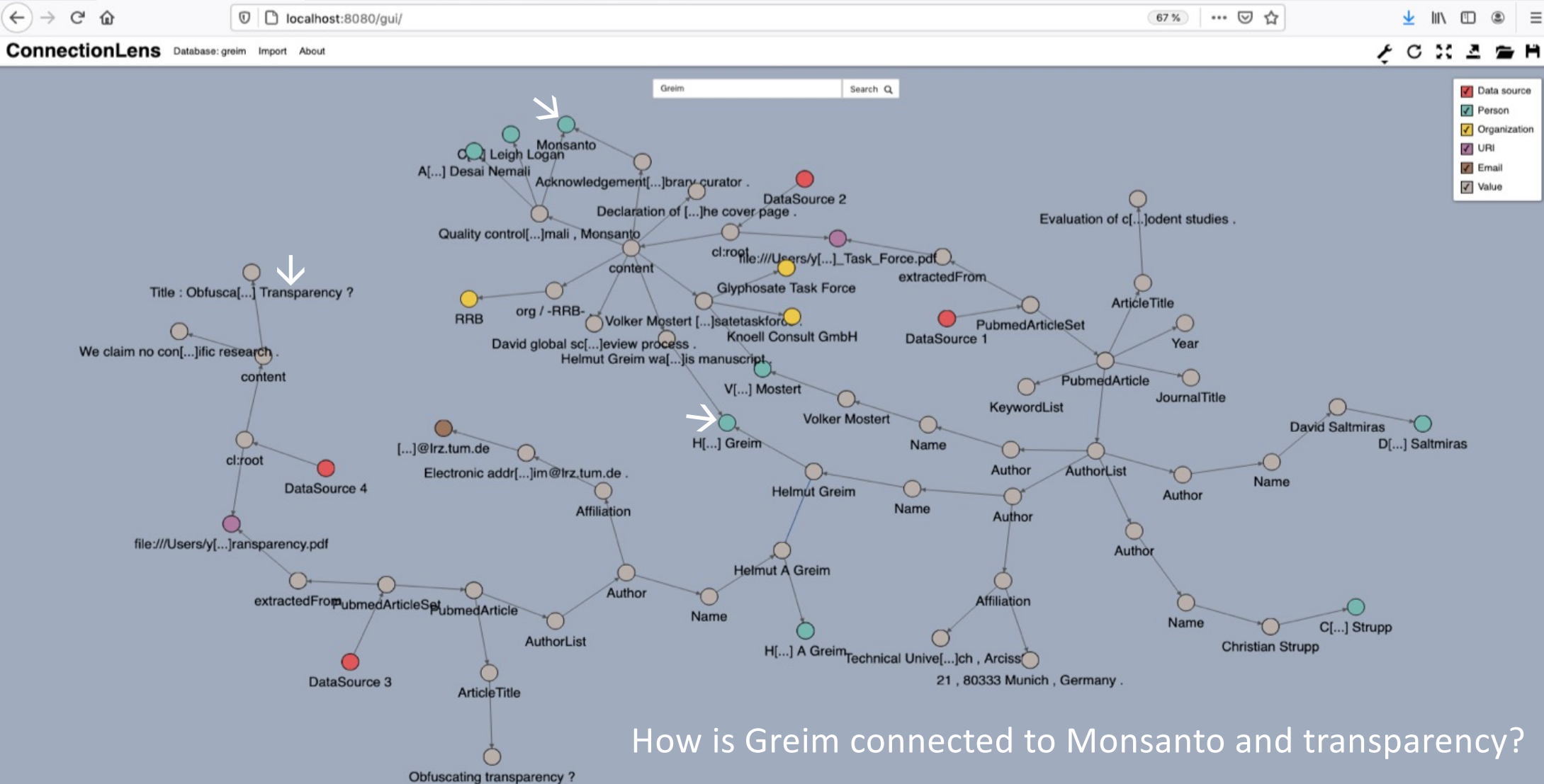
[InfSystems22, ICDE23, VLDB23, ADBIS23, CoopIS23, EACL23, EMNLP23]

Invited keynotes [DASFAA22, DEBS22, ICFA21, DOLAP21, ADBIS20, DATA20]

<https://connectionstudio.inria.fr> (code),

<https://sourcessay.inria.fr>





# How do we analyze statements?

**A statement is made**



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**What should we think of this?**



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**What should we think of this?**



Information?  
**Mis**information?  
**Dys**information?



# How do we analyze statements?

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**What should we think of this?**



Information?  
**Mis**information?  
**Dis**information?



Evaluate  
source authority  
(past statements...)

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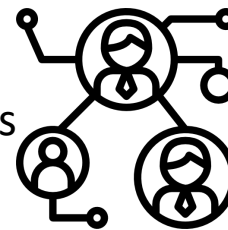


What should we think of this?



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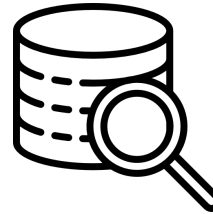
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# How do we analyze statements?

**A statement is made**



Consult  
reference  
data

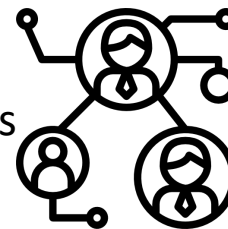


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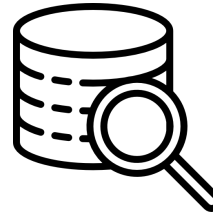
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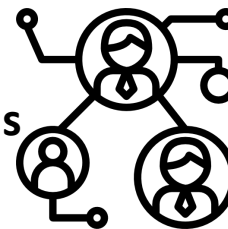


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# How do we analyze statements?

A statement is made



Information?

Misinformation?

Disinformation?



source  
connections



source past  
statements



fact-checks



reference  
data

# Fact-check retrieval pipeline

**A statement is made**



Consult  
reference  
data



**What should we think of this?**



Information?  
**Mis**information?  
**Dis**information?

**Goal:** given a statement, search for previous FC on this or a similar topic

- ☐ Recent FCs: to save effort (avoid checking again)
- ☐ Older FCs: false information is often repurposed, e.g., criminal son of a French minister, etc.
- ☐ Also talking points from malicious agents.

# The FC retrieval problem

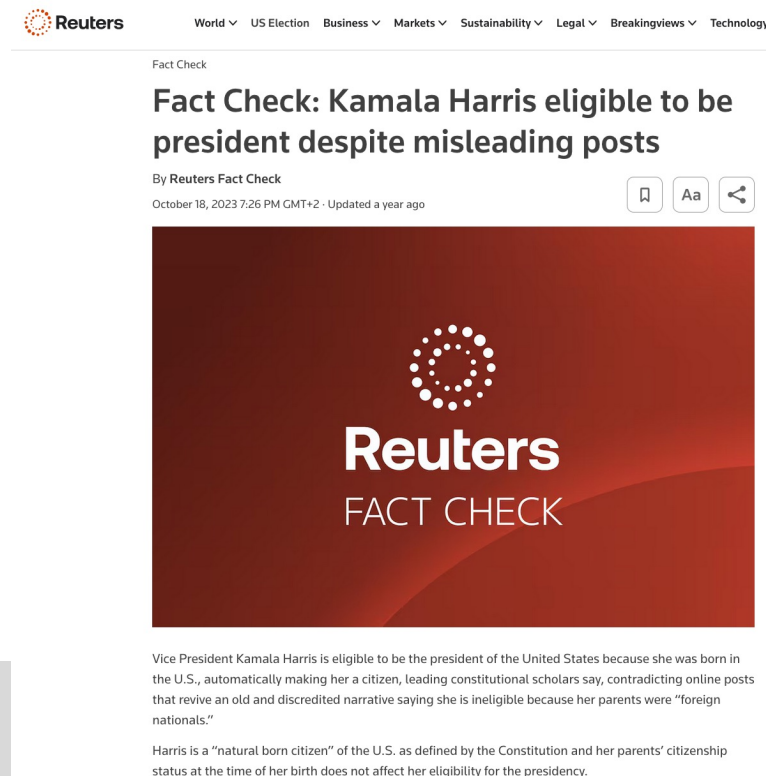
A **claim** is: a phrase, or a social media post, or an image (→ text)

A **fact-check** consists of: title, claimant, publisher, dateOfPublication, URLtoArticle, claimText, language and rating

ClaimText can be short-ish (a phrase)

URLtoArticle points to a long article

Title is typically related to claimText but not identical



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❑ Structure from de-facto standard (Google ClaimCheckReview)

**FC retrieval** is a 2-step process:

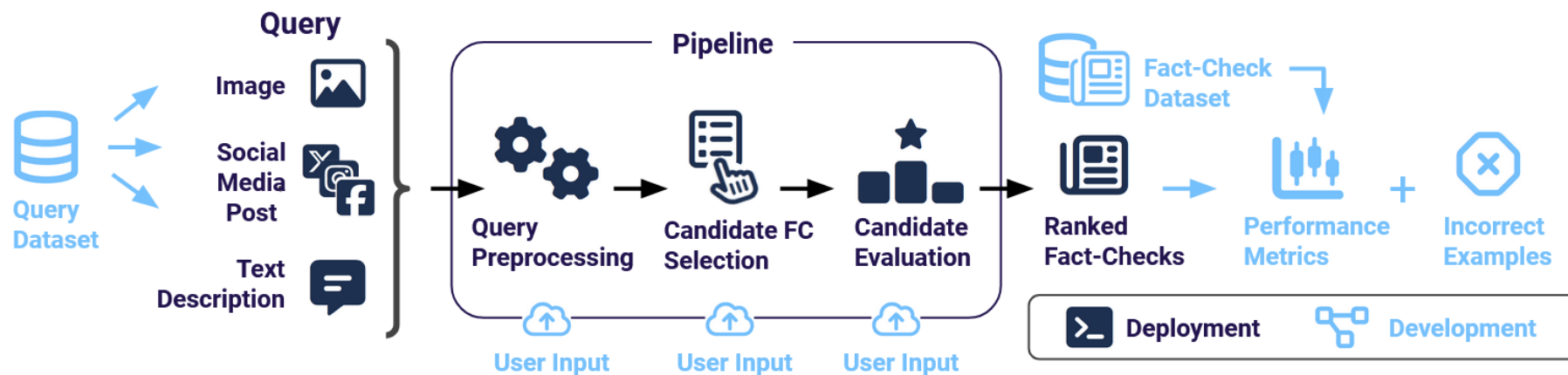
1. **Retrieval**: out of a potentially large FC set, given a claim, find possible candidates. Probabilistic vs. neural methods
2. **(Re-)ranking**: determine the relevance of each candidate, to show the most relevant first. Nowadays , typically neural methods (transformers)



# FactCheckBureau: a tool with many modes

We built our platform to support:

- ❑ Specialists (data scientists) **building** their pipelines: design, inspect, compare
- ❑ Non-expert users **using** a pipeline (journalists, collaboration with RadioFrance)



# Corpus and some results

## Corpus

218K claim reviews in 14 languages, from 83 fact-checking agencies recognized by IFCN (International Fact-Checking Network).

Include links to FC articles and sometimes tweets (\*)

❑ Narrowed to EN, FR

9.1K tweets mentioned in FC articles + 8K recent tweets from prominent Members of the European Parliament (4.7K EN, 1.2K FR)

→ 9.1K aligned pairs of (social media posts, FC articles)

## Insights

Article retrieval (P2A) worked better than claim retrieval (P2C)

Also very precise → we can afford to retrieve very few articles  
→ less effort to rank them

Augmenting tweets with generated image captions and/or OCR

On our EN corpus, OCR alone is best.  
On others, OCR+caption is best...



# Fact-checking and analyzing debates

Heterogeneous statistic datasets (INSEE, Eurostat, etc.) contain valuable **insights**

Extracting and fact-checking  
statistic claims from social  
media [CIKM22, TTO22, CIKM24]



<input type="checkbox"/> Insee <input checked="" type="checkbox"/> Eurostat <input type="checkbox"/> Tous		
Moyenne des émissions de CO2 france 2010		
TRIÉ PAR		
	2010	Moyenne des émissions de CO2 par kilomètre provenant de véhicules particuliers neufs (source: AEE, DG CLIMA) Publiée le 18/01/2022
France	130.5	
	2010	Moyenne des émissions de CO2 par kilomètre provenant de véhicules particuliers neufs (source: AEE, DG CLIMA) Publiée le 18/01/2022
France	130.5	
	Octobre - Décembre 2010	Compte d'émissions atmosphériques pour les gaz à effet de serre par activité de la NACE Rév. 2 - données trimestrielles Publiée le 15/02/2022
Gaz à effet de serre (CO2, N2O en équivalent CO2, CH4 en équivalent CO2, HFC en équivalent CO2, PFC en équivalent CO2, SF6 en équivalent CO2, NF3 en équivalent CO2), Agriculture, sylviculture et pêche, Mille	121859.472 s	
	2010	Emissions de gaz à effet de serre provenant de l'agriculture Publiée le 17/08/2021
Méthane, Pourcentage, Agriculture, Autriche	64.3	



# Propaganda detection

Public debates:

- ☐ Arguments (factual or not)
- ☐ Reasoning (valid or not)
- ☐ Various forms of propaganda



**Propaganda benchmark** from social networks (sub-Reddit) [EACL2021]

**Propaganda detection**

Deployed in StatCheck,  
used by **radiofrance**



Florian Philippot, le 06 mars 2024 à 17:12  
Voilà super tuesday et énorme triomphe de Donald Trump !



Florian Philippot, le 06 mars 2024 à 14:46  
Il y a beaucoup de Frexiters en France malgré l'immense pr



Jean-Philippe Tanguy, le 06 mars 2024 à 12:18  
L'effondrement moral et intellectuel de la macronie est pitoya



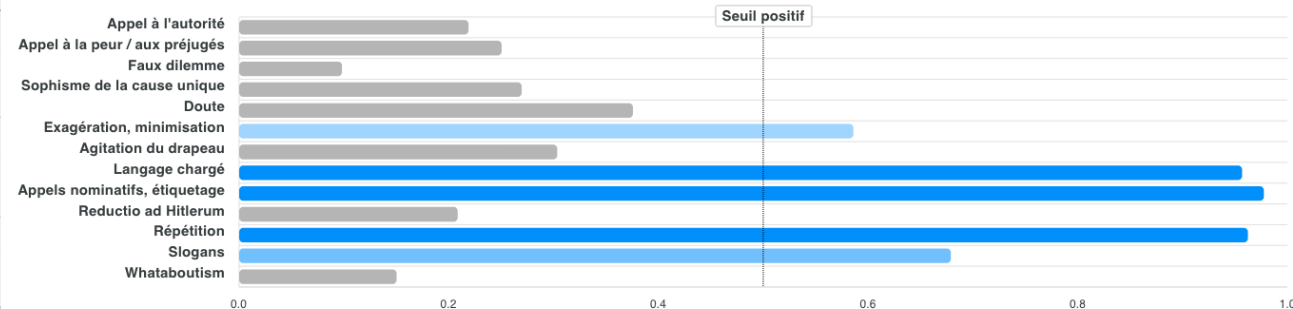
Jean-Philippe Tanguy, le 06 mars 2024 à 12:14  
L'effondrement moral et intellectuel de la macronie est pitoya



Florian Philippot, le 06 mars 2024 à 9:46  
Ça n'a pas été assez analysé : très discrètement Victoria Nul

Sa dernière rivale jette l'éponge, et tout le Système tremble de trouille à l'idée d'un Trump président ! (cf : ) Eh oui ce serait la fin de leurs délires sur l'Ukraine, fini les armes, l'argent,...

Score du modèle de détection: 83.54%



# Political advertising online

- ❑ + Communicate policy, engage with voters
- ❑ -- Risks: user targeting, spreading propaganda, disinformation

EU Digital Services Act: on platforms  $\geq 45M$  users

- ❑ Political ads must be **declared**
- ❑ Researchers, NGOs **must have access** to the ads to analyze them

First **AI analysis of 400.000 political ads in 2022 in France** on Meta [WebConf23]

Expertise and advice for EU and FR institutions



En raison de l'influence de TikTok, les juges roumains annulent la présidentielle

Le candidat prorusse arrivé en tête du premier tour du scrutin a dénoncé « un coup d'Etat »

Par Mirel Bran (Bucarest, correspondant)

Publié le 07 décembre 2024 à 04h30, modifié le 07 décembre 2024 à 10h18 · Lecture 4 min · [Read in English](#)

[Offrir l'article](#)

Article réservé aux abonnés





# Analysis of political ads in France, 2022

	Gender		Age						
	Female	Male	13-17	18-24	25-34	35-44	45-54	55-64	65
Population* (baseline)	53.94%	46.06%	2.68%	14.24%	22.79%	18.33%	15.14%	13.12%	13.52%
International affairs	53.64%	46.36%	0.18%	6.26%	22.22%	19.83%	16.64%	15.89%	18.98%
Energy	35.61%	64.39%	0.01%	1.74%	25.76%	34.49%	27.35%	7.88%	2.77%
Immigration	65.65%	33.35%	0.18%	4.6%	16.68%	17.06%	18.88%	20.57%	22.02%
Law and crime	51.88%	48.12%	28.57%	24.52%	8.46%	10.97%	9.3%	8.33%	9.85%
Government operations	53.35%	46.65%	0.92%	30.26%	27.32%	13.83%	9.7%	8.7%	9.23%
Cultural policy	51.53%	48.47%	3.17%	16.18%	23.32%	17.97%	15.63%	12.21%	11.52%
Social policy	65.34%	34.66%	0.93%	13.65%	19.74%	16.27%	14.51%	16.15%	18.74%
Education	59.19%	40.81%	11.4%	24.2%	16.6%	13.8%	9.67%	10.26%	14.79%
Environment	50.89%	49.11%	1.95%	10.78%	25.52%	21.91%	17.04%	12.17%	10.64%
Health	68.45%	31.55%	4.16%	8.62%	14.18%	18.12%	17.12%	18.42%	19.37%
Economy	44.24%	55.76%	0.01%	12.85%	22.25%	19.36%	15.67%	15.53%	14.34%
Human rights	59.31%	40.69%	8.74%	16.18%	20.09%	16.52%	13.54%	12 %	12.13%
Work and employment	61.27%	38.73%	0.84%	27.49%	19.03%	12.60%	14.79%	12.88%	12.37%
Urban and territorial policy	51.09%	48.91%	3.63%	6.32%	14.62%	15.90%	15.60%	17.65%	26.29%

 Over-exposed to a topic

 Under-exposed to a topic

# Overview of our research

## Big Data Management and Analytics

Exploring and  
querying  
RDF graphs

Exploration  
of large  
datasets

Taming  
heterogeneous  
data

Optimization  
for cloud  
data analytics

Data stream  
analytics

## Digital Democracy

Safe online  
political  
advertising  
& marketing

Uncovering  
exposure and  
(mis)information  
on social media

## Statistic

fact-checking

## Natural Language Processing

Information  
extraction and  
text generation

Argumentation  
mining



More information:

<https://team.inria.fr/cedar/>

<https://team.inria.fr/cedar/publications/>