

# CheckThat! 2023

6<sup>th</sup> edition

**Checkworthiness, Subjectivity, Political Bias, Factuality,  
and Authority of News Articles and Their Sources**

<http://checkthat.gitlab.io>

CLEF 2023 plenary session, 20 September, Thessaloniki, Greece

# Organisation



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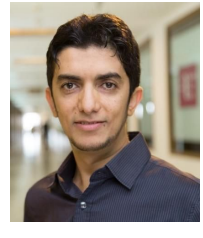
**Chengkai Li**



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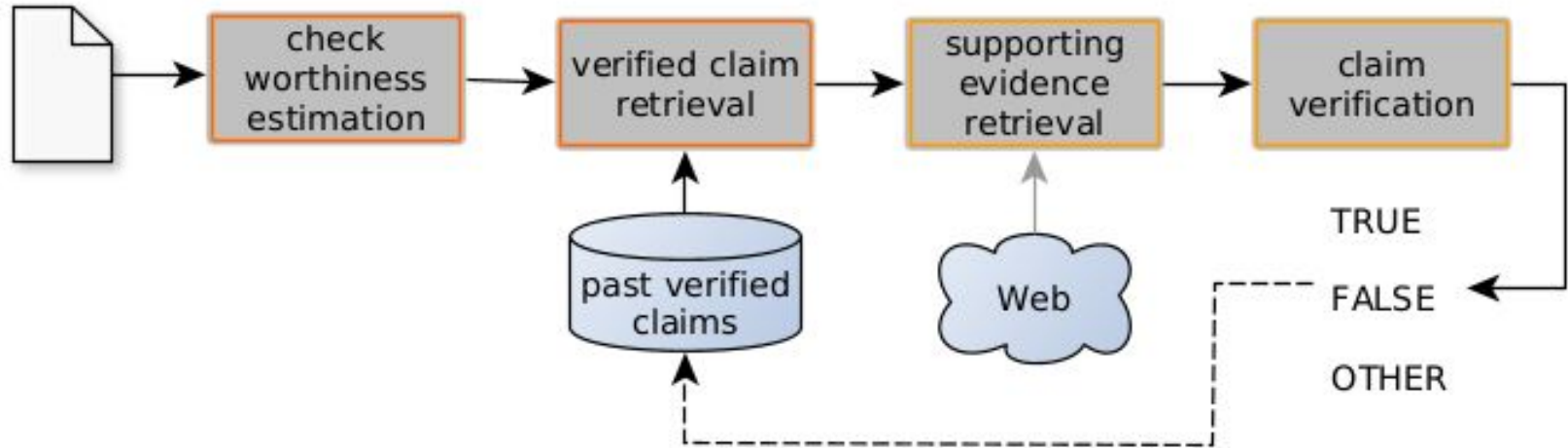


**Julia Maria Struß**



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# The CheckThat! Verification Pipeline

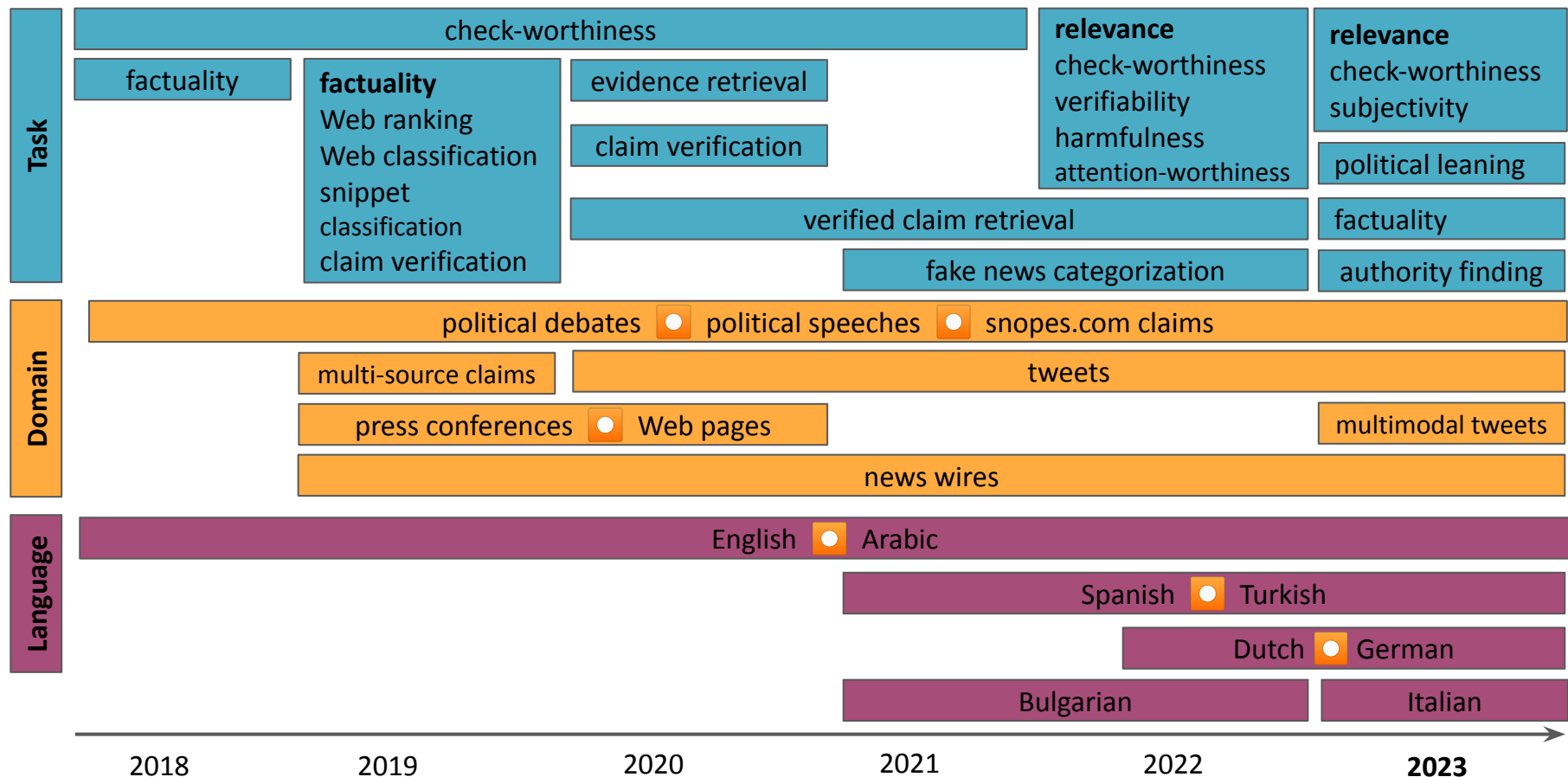


# The Focus in 2023



1. **Auxiliary** tasks for the verification process
2. **Multimodality**
3. Further **multilinguality**

# The Main Focus So Far



# The CheckThat! 2023 tasks



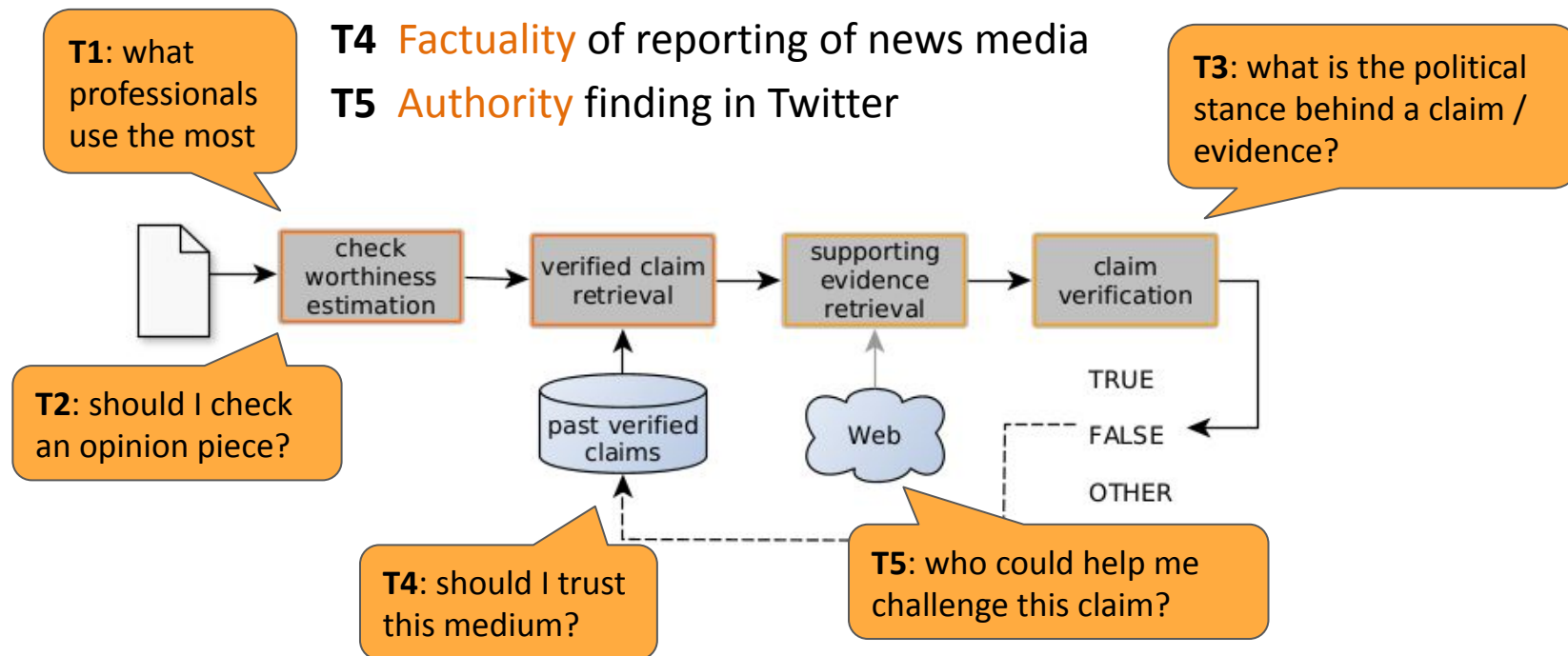
**T1** Check-worthiness in multi/unimodal contents

**T2** Subjectivity in news articles

**T3** Political bias of news articles/media

**T4** Factuality of reporting of news media

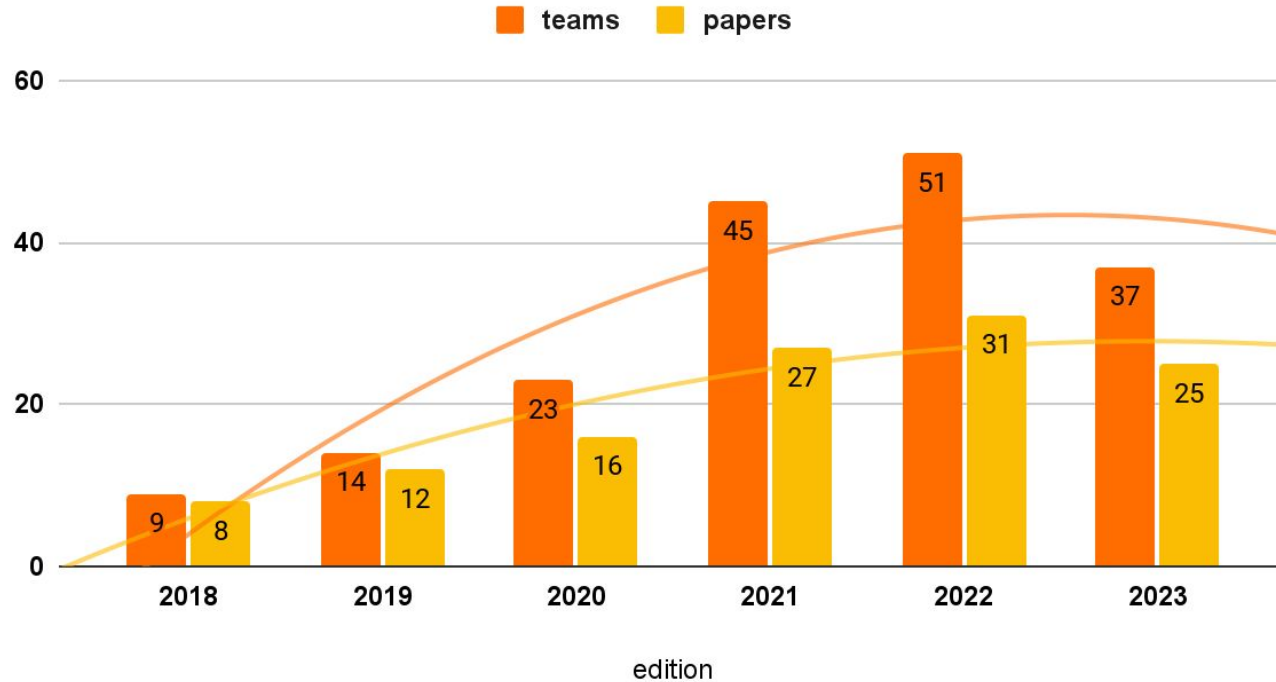
**T5** Authority finding in Twitter



# Evolution in Terms of Participation



## Participation



# CheckThat! 2023 Task 1



## Check-worthiness in Multimodal and Multigenre Content

**1A (Multimodal):** Assess whether a tweet—including both text and image—is check-worthy

ar • en

**1B (Multigenre):** Assess whether a text snippet alone—from a tweet or a debate/ interview/speech transcription—is check-worthy

ar • en • es



Checkworthy



# CheckThat! 2023 Task 1 - Model Highlights



## 1. Check-worthiness

**Transformers.** GPT-3, \*BERT, AraBERT, XLM-RoBERTa

**Multimodality:** Vision Transformer, CLIP, Ensemble (Text: BERT, Image: VGG, ResNet, EfficientNet)

**Others:** *Multilingualism paid*, Data augmentation

# CheckThat! 2023 Task 1



## Check-worthiness in Multimodal and Multigenre Content

**1A (Multimodal):** Assess whether a tweet—including both text and image—is check-worthy



We have the best, lowest number in carbon emissions, which is a big standard that I noticed Obama goes with all the time.

**1B (Multigenre):** Assess whether a text snippet alone—from a tweet or a debate/interview/speech transcription—is check-worthy

#عاجل لجنة المتابعة العليا للقوى الوطنية والإسلامية تعلن الإضراب الشامل لكل مرافق الحياة في غزة باستثناء الصحة غدًا الأربعاء وتدعو لرفع الأعلام السوداء واستمرار الاحتجاج المفتوح مع الاحتلال لإسقاط صفقة القرن #تسقط\_صفقة\_القرن  
<https://t.co/JidPBhfmEo>

**Translation:** Urgent: The Supreme Follow-up Committee of the National and Islamic Forces announces a comprehensive strike on all life facilities in Gaza, except for health, tomorrow, Wednesday, and calls for the raising of black flags and the continuation of open clashes with the occupation to bring down the deal of the century. #Down\_Deal\_of\_the\_Century  
<https://t.co/JidPBhfmEo>

Checkworthy

ar • en

ar • en • es



# CheckThat! 2023 Task 1

## Check-Worthiness in Multimodal and Multigenre Content

**1A (Multimodal):** Assess whether a tweet—including both text and image—is check-worthy



The Malaysian Ministry of Education has introduced E-Skrol, an application built on the NEM blockchain to deal with the issue of certificate fraud through the use of blockchain technology.

(a) Checkworthy



Turns out I've been doing airborne precautions wrong my whole life.  
#coronavirus

(b) Not-checkworthy

**1B (Multigenre):** Assess whether a text snippet alone—from a tweet or a debate/interview/speech transcription—is check-worthy

الان عودة الاشتباكات العنيفة في نهم والجيش الوطني يسحق الحوثيين في وادي حريب

**Translation:** Now the violent clashes are back in Nehm, and the national army is crushing the Houthis in Wadi Harib

(c) Checkworthy

واقعيًا مليشيا الإصلاح بـ #مارب هي خط الدفاع الأول عن الحوثيين

**Translation:** Realistically, the Islah militia in Marib is the first line of defense for the Houthis

(d) Not checkworthy



# CheckThat! 2023 Task 2

**Subjectivity in News Articles.** Determine whether a sentence from a news article is subjective or objective (binary classification)

Leftists claim the perfectly good legal phrase “illegal alien” is somehow sinister and dehumanizing.

SUBJ

It is not entirely clear how BA.4.6 has emerged, but it’s possible it could be a recombinant variant.

OBJ

Voi siete il governo peggiore in assoluto.  
[You are absolutely the worst government]

SUBJ



## 2. Subjectivity

**Transformers.** \*BERT, RoBERTa versions (best models)

**ChatGPT, GPT-3**

**Data augmentation** backtranslation, style change, GPT\*

**Multilingual training**

# CheckThat! 2023 Task 3



**Subtask 3A:** Given an article, classify its political leaning as left, center, or right.

**Subtask 3B:** Given the news article(s) from a news outlet (e.g., www.cnn.com), predict the overall political bias of that news outlet as left-, center- or right-leaning.

## Ford temporarily lays off hundreds of workers at Michigan plant where UAW is on strike

Economy And Jobs, Labor, Auto Industry, Ford, Strikes

Posted on AllSides September 16th, 2023



From The Left



MATTHEW HATCHER/AFP VIA GETTY IMAGES

Ford Motor said it had temporarily laid off 600 non-striking workers at its assembly plant in Wayne, Michigan, only hours after other employees at the facility had walked off the job early Friday as part of the United Auto Workers' historic strike against the Big Three automakers.

The labor union launched targeted work stoppages at the plant, along with a General Motors factory in Wentzville, Missouri, and a Stellantis plant in Toledo, Ohio, after failing to reach a new labor agreement with the

CBS News (Online)



AllSides Media Bias Rating: **Lean Left**

☒ agree ☐ disagree

## TikTok and White House return to negotiating table over app's fate in US

Technology, TikTok, Business, White House

Posted on AllSides September 15th, 2023



From The Right

TikTok has restarted its efforts to negotiate with the government on whether it will be allowed to continue operations in the United States or be banned over its connections to China.

Teams from TikTok parent company ByteDance and the Committee on Foreign Investment in the United States met at the Treasury Department to restart negotiations last week, according to the Washington Post. There's little evidence that CFIUS, an oversight agency regulating how foreign companies operate within the U.S., has changed its stance. The government previously said the company had two options: wait for...

## Washington Examiner



AllSides Media Bias Rating: **Lean Right**

☒ agree ☐ disagree

Language: en



## 3. Political leaning/bias

**LLMs:** ChatGPT (Zero-, few-shot prompting)

**Data Augmentation:** Back translation

**Transformers.** RoBERTa

# CheckThat! 2023 Task 4

Given the news article(s) of a news outlet (e.g., [www.cnn.com](http://www.cnn.com)), predict the factuality of reporting of that news outlet: low, mixed, or high.



| Factual Reporting |
|-------------------|
| Very High         |
| High              |
| Mostly Factual    |
| Mixed             |
| <b>LOW</b>        |
| Very Low          |

## QUESTIONABLE SOURCE

A questionable source exhibits *one or more* of the following: extreme bias, consistent promotion of propaganda/conspiracies, poor or no sourcing to credible information, a complete lack of transparency, and/or is fake news. Fake News is the *deliberate attempt* to publish hoaxes and/or disinformation for profit or influence ([Learn More](#)). Sources listed in the Questionable Category *may* be very untrustworthy and should be fact-checked on a per-article basis. Please note sources on this list *are not* considered *fake news* unless specifically written in the reasoning section for that source. [See all Questionable sources.](#)

- Overall, we rate the American Thinker, Questionable based on extreme right-wing bias, promotion of conspiracy theories/pseudoscience, use of poor sources, and several failed fact checks.





## 4. Factuality of reporting

**Transformers:** Both teams used RoBERTa

Regularized adversarial training (top system)

Data augmentation

# CheckThat! 2023 Task 4

Given the news article(s) of a news outlet (e.g., www.cnn.com), predict the factuality of reporting of that news outlet: low, mixed, or high.



| Factual Reporting |
|-------------------|
| Very High         |
| High              |
| Mostly Factual    |
| Mixed             |
| <b>LOW</b>        |
| Very Low          |

## QUESTIONABLE SOURCE

A questionable source exhibits *one or more* of the following: extreme bias, consistent promotion of propaganda/conspiracies, poor or no sourcing to credible information, a complete lack of transparency, and/or is fake news. Fake News is the *deliberate attempt* to publish hoaxes and/or disinformation for profit or influence ([Learn More](#)). Sources listed in the Questionable Category *may* be very untrustworthy and should be fact-checked on a per-article basis. Please note sources on this list *are not* considered *fake news* unless specifically written in the reasoning section for that source. [See all Questionable sources.](#)

- Overall, we rate the American Thinker, Questionable based on extreme right-wing bias, promotion of conspiracy theories/pseudoscience, use of poor sources, and several failed fact checks.

## Detailed Report

Reasoning: **Conspiracy, Propaganda, Lack of Ownership Transparency, Failed Fact Checks**  
 Bias Rating: **EXTREME RIGHT**  
 Factual Reporting: **LOW**  
 Country: **USA**  
 Press Freedom Rating: **MOSTLY FREE**  
 Media Type: **Website**  
 Traffic/Popularity: **High Traffic**  
 MBFC Credibility Rating: **LOW CREDIBILITY**



| Factual Reporting |
|-------------------|
| Very High         |
| High              |
| Mostly Factual    |
| <b>MIXED</b>      |
| Low               |
| Very Low          |

## RIGHT-CENTER BIAS

These media sources are slight to moderately conservative in bias. They often publish factual information that utilizes loaded words (wording that attempts to influence an audience by appeals to emotion or stereotypes) to favor conservative causes. These sources are generally trustworthy for information but may require further investigation. [See all Right-Center sources.](#)

- Overall, we rate 7NEWS Right-Center Biased based on story selection and editorial positions that favor the right. We also rate them Mixed for factual reporting due to a few false and controversial claims.

## Detailed Report

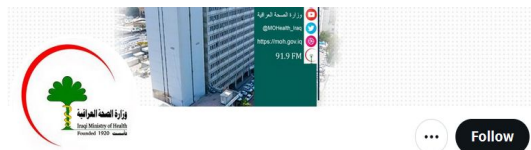
Bias Rating: **RIGHT-CENTER**  
 Factual Reporting: **MIXED**  
 Country: **Australia**  
 Press Freedom Rating: **MOSTLY FREE**  
 Media Type: **TV Station**  
 Traffic/Popularity: **High Traffic**  
 MBFC Credibility Rating: **MEDIUM CREDIBILITY**

Language: en

# CheckThat! 2023 Task 5



**Authority Finding in Twitter:** Given a tweet stating a rumor, retrieve a ranked list of authority Twitter accounts that can help verify the rumor, e.g., they may tweet evidence that supports or denies that rumor.



**Ministry of Health**  
@MOHealth\_Iraq

الحساب الرسمي لوزارة الصحة العراقية

t.me/mohmedia Joined September 2017



**سيف البدر Saif Al-Badr**  
@Saif\_Al\_Badr

Spokesman for the | المتحدث الرسمي لوزارة الصحة العراقية | Iraqi Ministry of Health

t.me/saifbadr

Iraq Joined September 2017

name  
@username

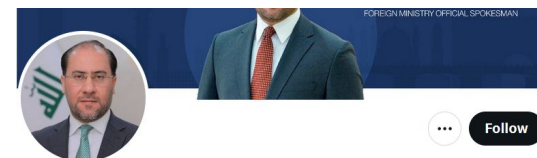
وزارة الصحة العراقية تطالب بإغلاق الحدود مع إيران خوفا من انتشار كورونا

#العراق\_ينتفض

Translated from Arabic by Google

The Iraqi Ministry of Health demands closing the border with Iran for fear of the spread of Corona

#العراق\_ينتفض



**Dr. Ahmed Al-Sahhaf**  
@DrAhmedAlSahhaf

المتحدث الرسمي باسم وزارة الخارجية العراقية | Iraqi Foreign Ministry official spokesman

Iraq, Baghdad mofa.gov.iq Joined September 2019



**المكتب الإعلامي لرئيس الوزراء**  
@IraqiPMO

The Official Account of / الحساب الرسمي للمكتب الاعلامي لرئيس مجلس الوزراء العراقي / the Iraqi Prime Minister Media Office

Iraq Joined January 2015



## 5. Authority finding

**Lexical retrieval.** BM25

**Semantic retrieval.** Arabic BERT, MARBERT

**Hybrid retrieval.** Lexical + Semantic + Twitter user features

# CheckThat! 2023 Datasets Overview



|   | ar              | de    | nl    | en     | es     | it    | tr    | total                   |
|---|-----------------|-------|-------|--------|--------|-------|-------|-------------------------|
| <b>1A*</b>  | 4,134           |       |       | 3,911  |        |       |       | <b>8,045</b>            |
| <b>1B</b>   | 8,926           |       |       | 23,851 | 29,984 |       |       | <b>62,761</b>           |
| <b>2</b>  | 1,927           | 1,291 | 1,500 | 1,292  |        | 2,280 | 1,240 | <b>9,530</b>            |
| <b>3A</b>   |                 |       |       | 55,272 |        |       |       | <b>55,272</b>           |
| <b>3B</b>   |                 |       |       | 1,023  |        |       |       | <b>1,023</b>            |
| <b>4</b>  |                 |       |       | 1,189  |        |       |       | <b>1,189</b>            |
| <b>5</b>  | 180 R<br>395k U |       |       |        |        |       |       | <b>180 R<br/>395k U</b> |
| * Multimodal (twitter text + picture)    R: rumours    U: users |                 |       |       |        |        |       |       |                         |



# Programme - Thursday 21st

| Time (EET)  | Summary   |
|-------------|---|
| 9:30-10:10  | Detailed CheckThat! lab overview                              |
| 10:10-11:00 | Participant talks, Task 1                                     |
| 11:30-13:00 | Participant talks, Tasks 2 and 3                              |
| 14:00-15:30 | Participant talks, Tasks 4 and 5                              |
| 14:30-15:30 | Invited talks: Yarden Skop and Paolo Rosso<br>Open discussion |

# Programme - Thursday 21st



## Time (EET) Highlights

9:30-10:10 Detailed CheckThat! lab overview

10:10-11:00 Participant talks, Task 1

11:30-13:00 Participant talks, Tasks 2 and 3

14:00-15:30 Participant talks, Tasks 4 and 5

14:30-15:30 Invited talks  
Open discussion

# Invited talks: 14:30 - 16:00 - Thursday 21st



**Yarden Skop** The perils of automated fact checking, and how we can deal with them together

**Paolo Rosso** CheckThat! Emotions, images and conspiracy theories





# CheckThat! 2023

<https://checkthat.gitlab.io>

