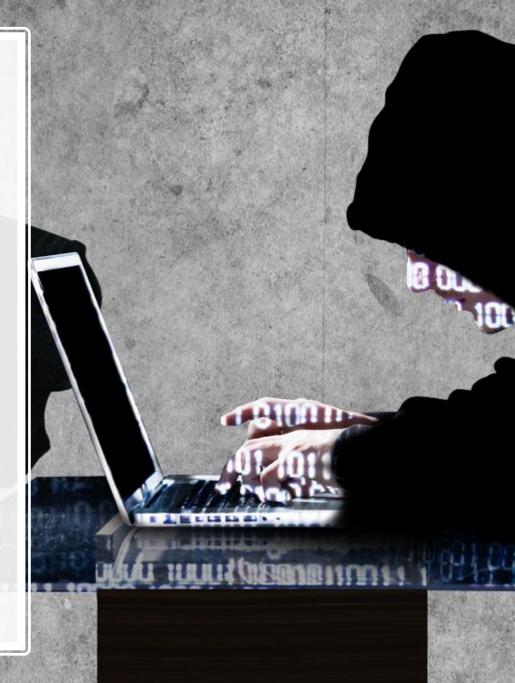
# Online Radicalisation

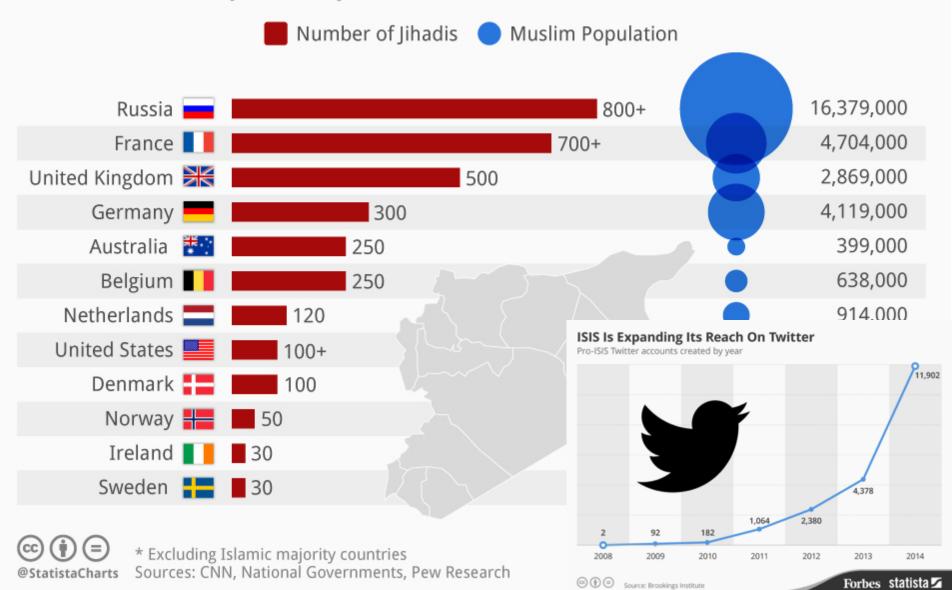
• Is the process by which individuals are introduced to ideological messages and belief systems that encourage movement from mainstream beliefs toward extreme views, primarily through the use of online media [International Assoc of Chiefs of Police and United States of America]

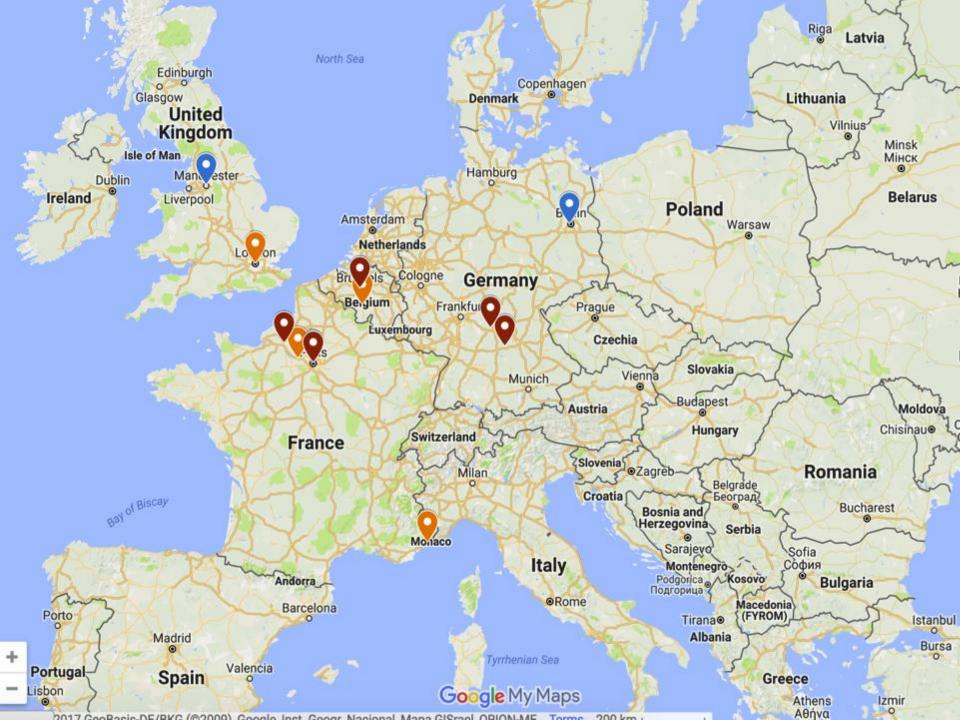


Social Media Propaganda & Recruiting لاالهالاالله Islamic State in Iraq and Syria (ISIS) رسول TURKEY Mosul Aleppo Baiji **SYRIA** Tikrit LEBANON IRAN Falluja Damascus **IRAQ** Baghdad ISRAEL **OCCUPIED BY** SAUDI ARABIA **MILITANTS JORDAN EYGPT** 

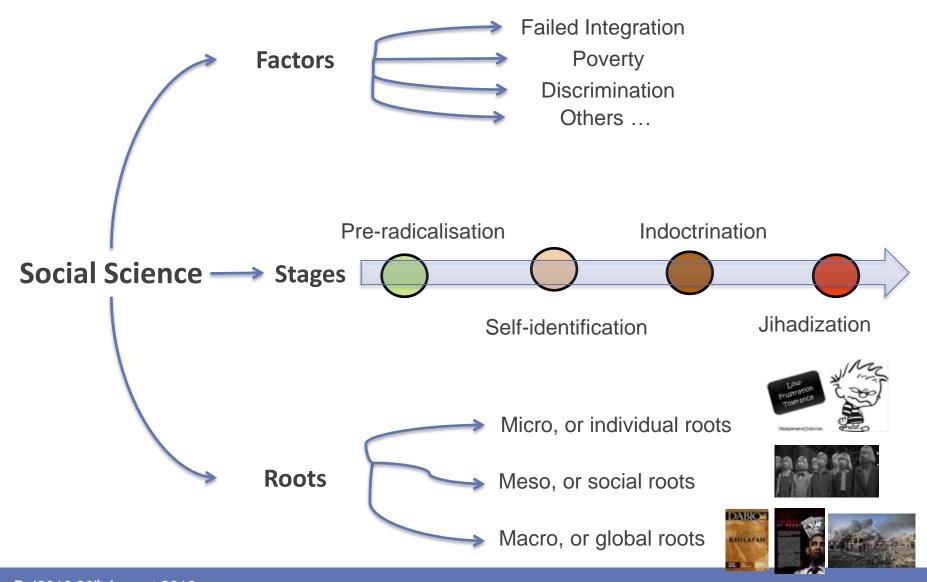
## Where Syria's Foreign Fighters Come From

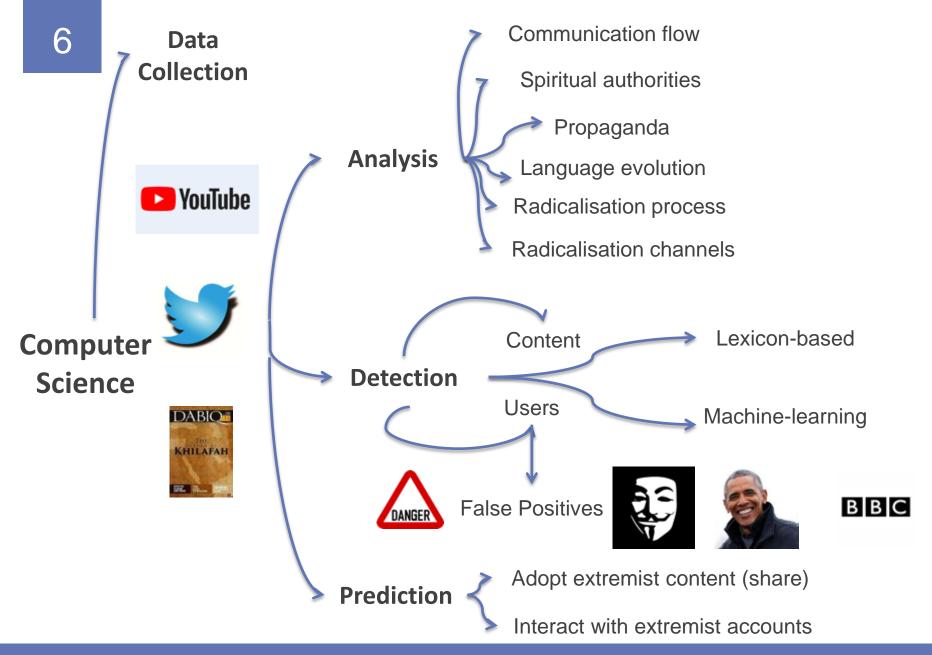
Estimated number of jihadis in Syria from selected countries in 2014\*





What are the mechanisms that govern the process of radicalisation, and online radicalisation in particular?





The majority of "ground truth" datasets used to research online radicalisation lack of solid verification

# Anonymous 'anti-Islamic State list' features Obama and BBC News



http://www.bbc.co.uk/newsbeat/article/34919781/anonymous-anti-islamicstate-list-features-obama-and-bbc-news





# Online Radicalisation: Towards the Generation of Gold Standard Datasets

Presenting: Miriam Fernandez, Knowledge Media Institute Open University



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@miriamfs



Miriam Fernandez

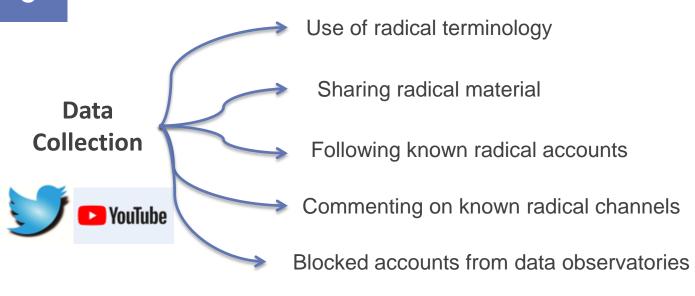


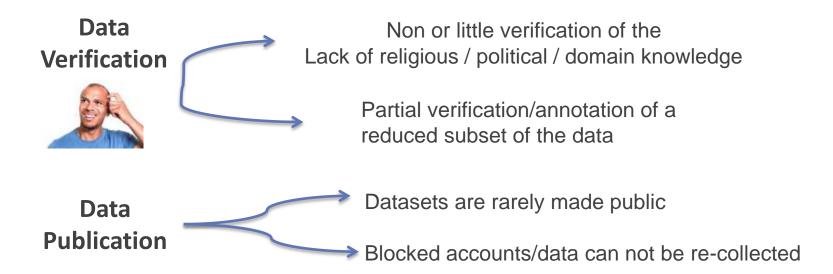
Moizzah Asif

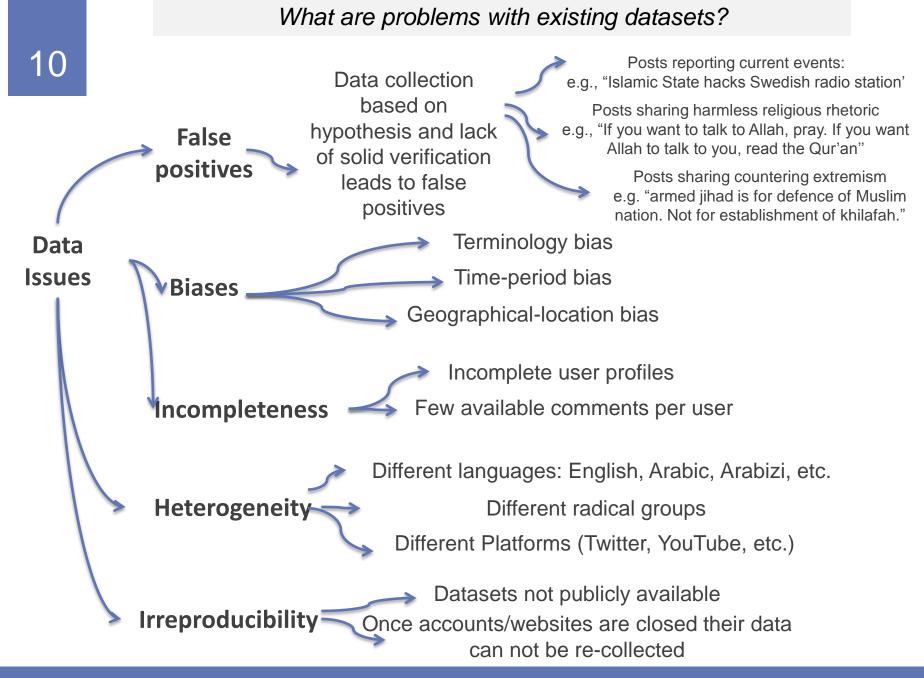


Harith Alani

# What are the mechanisms to collect, verify and published datasets?







# Radicalisation Analysis Works & Datasets

Work	Goal	Data	PA
Klausen [19] A	Study Influence in the jihadists' operational strategy in Syria and Iraq	59 pro-ISIS Twitter accounts (manually assessed) and their networks (29,000 accounts)	No
Carter [11] A	Examine how foreign fighters receive information and who inspires them	190 pro-ISIS Twitter and Facebook accounts (manually assessed)	No
Chatfield [12] A	Investigate how ISIS members/ supporters used Twitter to radicalise and recruit other users	3,039 tweets from one account of a known ISIS "information disseminator" (Twitter)	No
Rowe [28] A	Study Europe-based Twitter users before, during, and after they exhibited pro-ISIS behaviour to better understand the radicalisation process	727 pro-ISIS Twitter accounts. Categorised as pro-ISIS base on the use of radicalised terminology and sharing from radicalised accounts	No
Bermingham [7] A	Explore the use of sentiment and network analysis to determine whether a YouTube group was used as radicalisation channel	135,000 comments and 13,700 user profiles. YouTube group manually assessed	No

PA = Publicly Available

## Radicalisation Detection Works & Datasets

Work	Goal	Data	PA
Berger [5] D	Identify individuals prone to extremism from the followers of extremist accounts	3,542 Twitter accounts (followers of 12 known pro-ISIS accounts)	No
Saif [29] D	Create classifiers able to automatically identify pro-ISIS users in social media.	1,132 Twitter users (566 pro-ISIS, 556 anti-ISIS). Annotation based on the terminology used and the sharing from known radicalised accounts	No
Berger [6] D	Create a demographic snapshot of ISIS supporters on Twitter and outline a methodology for detecting pro-ISIS accounts	20,000 pro-ISIS Twitter accounts (7574 manually annotated to test classification)	No
Agarwal [2] D	Automatic identification of hate and extremism promoting tweets	10,486 hate and terrorism-related Twitter posts extracted based on hashtags) + 1M random tweets annotated by students for validation	No
Ashcroft [3] D	Automatically detect messages released by jihadist groups on Twitter	2,000 pro-ISIS Twitter posts (containing pro-ISIS terminology and extracted from the accounts 6,729 ISIS sympathisers), 2,000 anti-ISIS tweets(extracted from manually assessed anti-ISIS accounts), 2000 random tweets. Numbers of pro and anti-ISIS tweets are not reported but estimated based on the experiments	No
Lara-Cabrera [22] D	Translate a set of indicators found in social science models into a set of computational features	17K Twitter posts from pro-ISIS users provided by Kaggle. 76K tweets from pro-ISIS users provided by Anonymous. 173K tweets randomly selected	Yes

## Radicalisation Prediction. Works & Datasets

Work	Goal	Data	PA
Ferrara [16] P	Propose a computational framework for detection and prediction of extremism in social media	Over 3M Twitter posts generated by over 25 thousand extremist accounts (manually identified, reported, and suspended by Twitter [15]). 29M posts from the followers of these accounts	No longer available

References available at: Fernandez, Miriam, Moizzah Asif, and Harith Alani.

"Understanding the Roots of Radicalisation on Twitter."

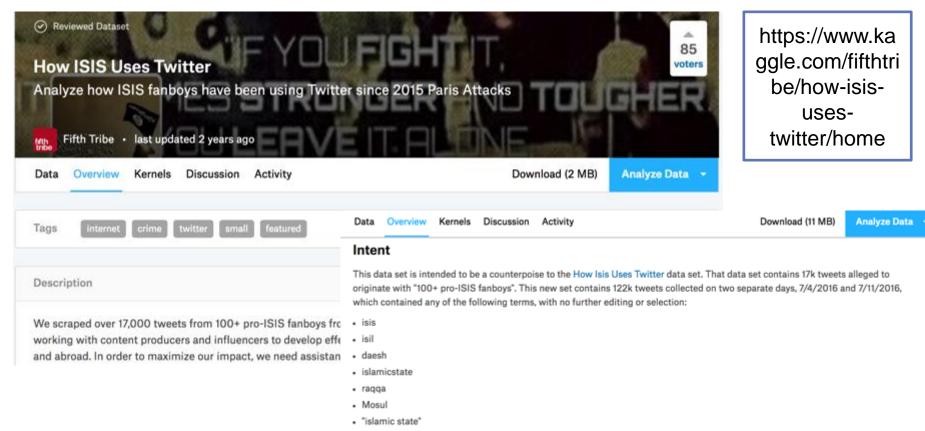
(10th ACM Conference on Web Science, Amsterdam, 27-30 May 2018)

http://oro.open.ac.uk/54344/1/wbsc052-fernandezA-hm.pdf

## 14

# The Kaggle Datasets



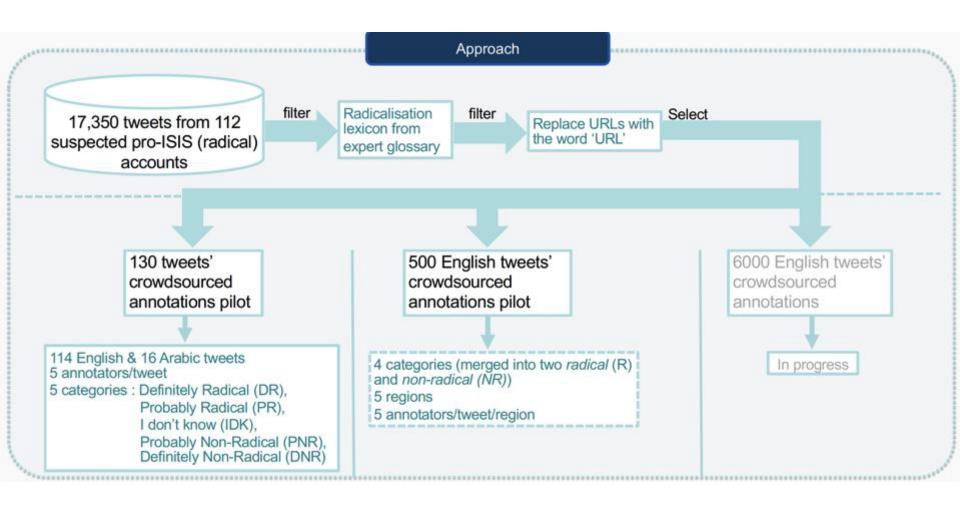


https://www.kaggle.com/active galaxy/isis-relatedtweets/home This is not a perfect counterpoise as it almost surely contains a small number of pro-Isis fanboy tweets. However, unless some entity, such as Kaggle, is willing to expend significant resources on a service something like an expert level Mechanical Turk or Zooniverse, a high quality counterpoise is out of reach.

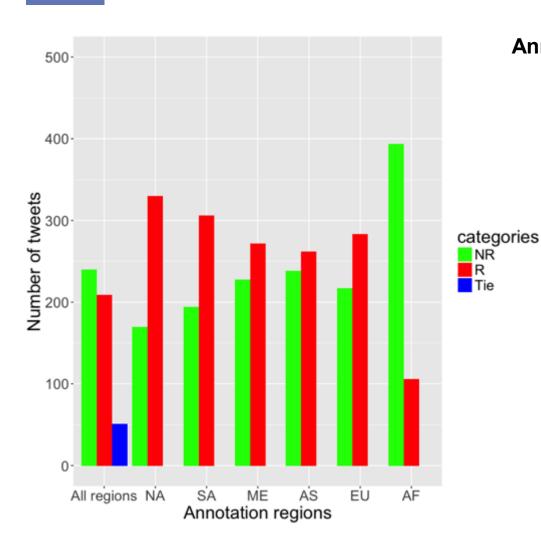
A counterpoise provides a balance or backdrop against which to measure a primary object, in this case the original pro-Isis data. So if anyone wants to discriminate between pro-Isis tweets and other tweets concerning Isis you will need to model the original pro-Isis data or signal against the counterpoise which is signal + noise. Further background and some analysis can be found in this forum thread.

This data comes from postmodernnews.com/token-tv.aspx which daily collects about 25MB of Isis tweets for the purposes of graphical display. PLEASE NOTE: This server is not currently active.

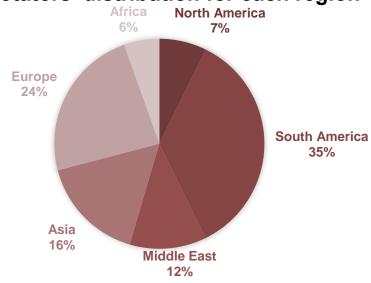
# Crowdsourcing Tweets to create Gold Standard Datasets for Online-Radicalisation Studies







#### Annotators' distribution for each region



Annotators from different regions of the world have different perceptions of radicalisation

## Conclusions & Future Work

- The majority of ground truth datasets used to study online radicalisation lack of solid verification
- We continue to observe false positives, incompleteness and biases in those datasets
- Many of existing datasets are not currently available and recollecting data is no longer possible
- Obtaining and annotating data to create reliable gold standard datasets (as well as sharing them for reproducibility purposes) are key future steps for research on online radicalisation.



### TRIVALENT

Terrorism pReventIon Via rAdicaLisation countEr-NarraTive

TRIVALENT is an EU funded project which aims to a better understanding of root causes of the phenomenon of violent radicalisation in Europe in order to develop appropriate countermeasures, ranging from early detection methodologies to techniques of counter-narrative.

READ MORE



# Centre for Policing Research and Learning















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#### News

#### CPD Week day 5 - Our partnerships

Our final contribution to CPD Week focuses on some of the work we have done in collaboration with our partners from the College of Policing and police forces that are members of the Centre.

#### CPD Week day 4 - Most viewed courses and videos

For our CPD week theme today we are going to focus on the courses that you have already found the most

#### Future events

Membership Group Meeting

December 5th, 2017

Society of Evidence Based Policing Conference 2018

March 1st, 2018 to March 2nd, 2018

#### Digital Health and Wellbeing Conference

April 30th, 2018 to May 3rd, 2018

#### Tweets



OU-Police-Consortium 2 days 4 hours ago

@OU\_police\_res

Many congrats Arosha @arosha! https://t.co/09ldCB66g5



#### OU-Police-Consortium 2 days 4 hours ago

@OU\_police\_res

Inaugural Lecture in Milton Keynes and online 28 Nov 2017, 6-7pm by Professor Distant Dates, Am J Massaul 11 11 1111