Old Questions, Big Data: Using the African Digital News (ADN) Corpus to Study News Flows

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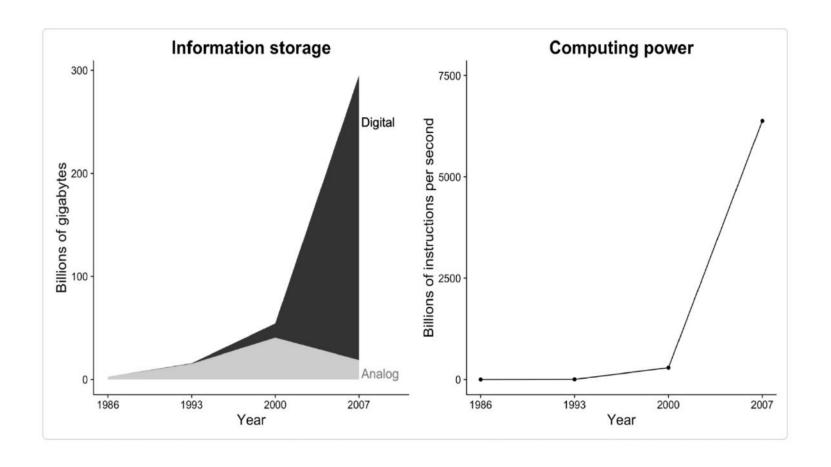


Outline

- 1. Computational Text Analysis
- 2. African Digital News (adn) corpus
- 3. Applications
 - 1. Revisiting the study of News Flows
 - 2. Revisiting the study of Foreign News
- 4. Q&A



- Social Scientists have always used texts as data.
- There are costs (human labor) to large-scale text analysis.
- Computers can lower these costs.
 - Growth in computational power at relatively low costs.
 - Facilitated by widespread digitization of information.



Computational Social Sciences

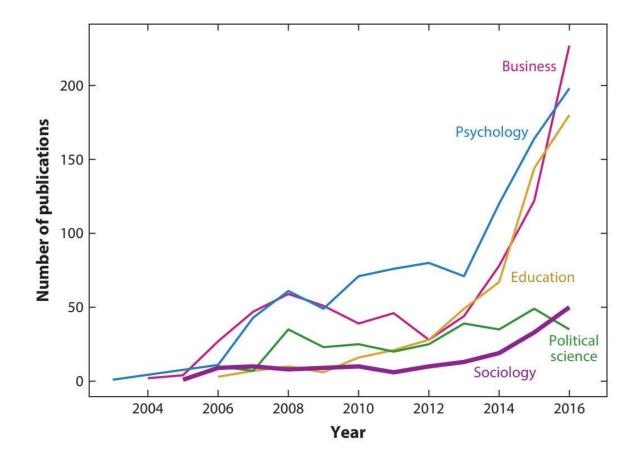


Figure 1

Number of computational social science publications by year—2003–2016—across four scholarly disciplines.

Eddelmann et al. (2020)

- By using computational tools researchers can...
 - "provide 'harder' evidence for what journalism scholars might already have suspected based on qualitative or small-scale quantitative research"
 - "identify patterns in journalistic data that traditional analysis would not" (Boumans and Trilling 2016, 9)
- In addition, computational approaches make it easier to "revisit" theories, assumptions and questions from longitudinal and comparative perspective.

Computational Text Analysis – Pros & Cons

- Computational approaches can be useful to answer certain types of questions, but not others.
 - Computational methods are great for mechanic and repetitive tasks
 - Computational methods can help find patterns and classify documents
 - Computational methods cannot interpret meanings of texts
 - Computational methods are no substitute of any other research method.
- In other words, computers are good at organizing a haystack, but are terrible (for now) at analyzing individual straws of hay.

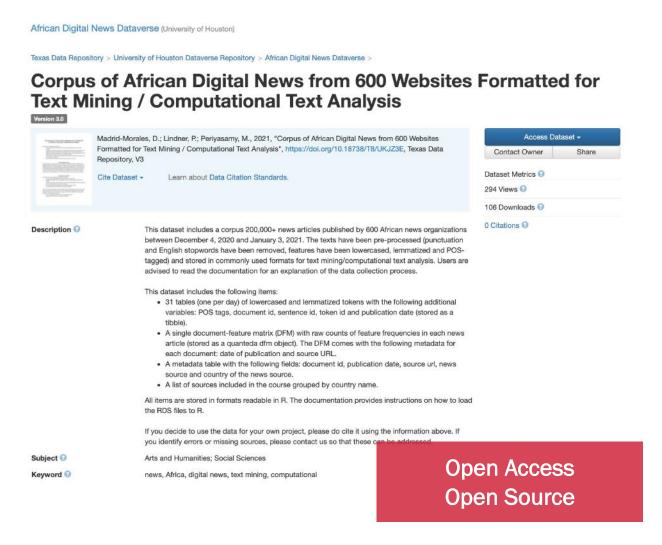
African Digital News (adn) corpus



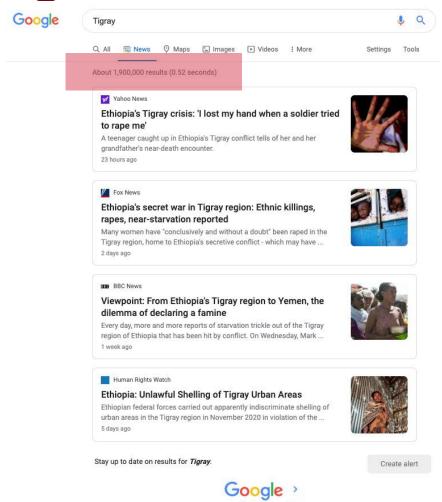
Africa Digital News (adn) Corpus

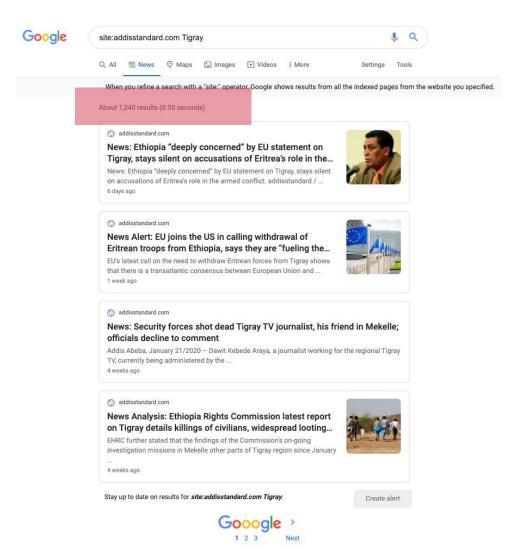
■ In 2019 we started a pilot project to monitor news content on digital news in Africa in real time to create a live corpus of news.

We built this using R and Python.

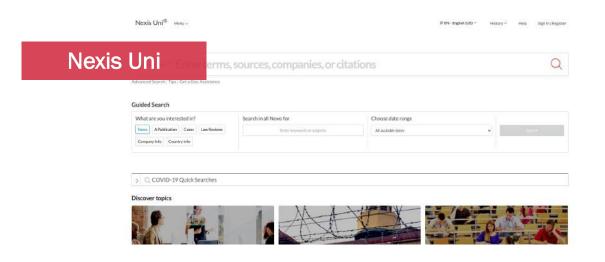


Algorithmic biases

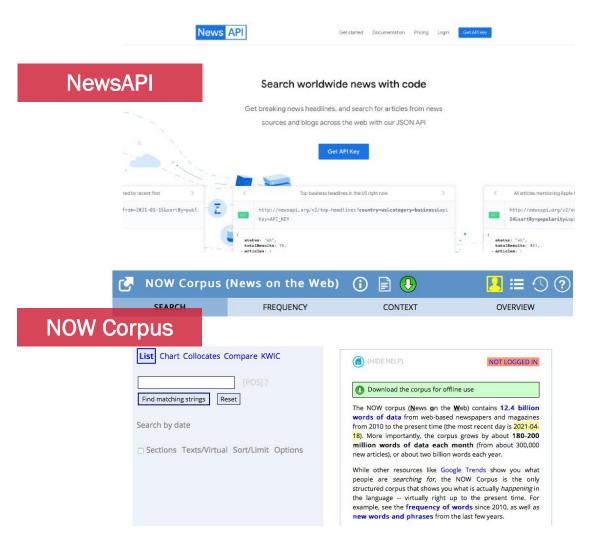




Limitations of existing archives/corpora







Content Analysis of African News Media

Table 1. Academic articles using content analysis to study news content in Africa published between 2015 and 2019, in selected journals.

	Percentage ($N = 47$)
Object of study	
Newspapers	40.4
Social media	23.4
News websites	21.3
TV	4.3
Magazines	4.3
Other	6.3
Region of study	
Multiple countries	14.9
Single country—Central Africa	2.1
Single country—East Africa	12.8
Single country—North Africa	4.3
Single country—Southern Africa	44.6
Single country—West Africa	21.3
Sampling method	
Not random	80.8
Random	2.1
Census	12.8
Not specified	4.3
Sample size	
Under 50	25.5
Between 51 and 200	25.5
Between 201 and 500	14.9
Between 501 and 1000	10.6
Over 1001	17.1
Not specified	6.4
Data collection method	
Manual retrieval	63.8
Website search	12.9
Data mining	8.5
Database search	2.1
Google search	2.1
Not specified	10.6

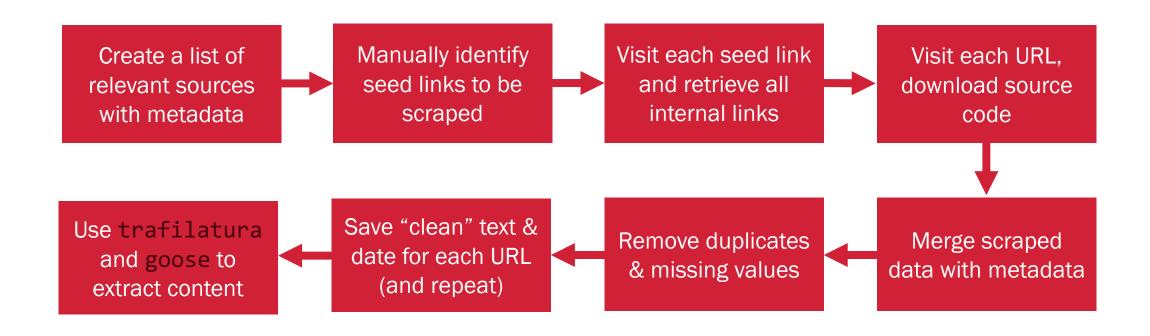
Relatively limited research on online news content

Very few studies are comparative

Sample size of most studies is small (less than 1,000)

Data collection is often manual (i.e. labor intensive)

adn Corpus

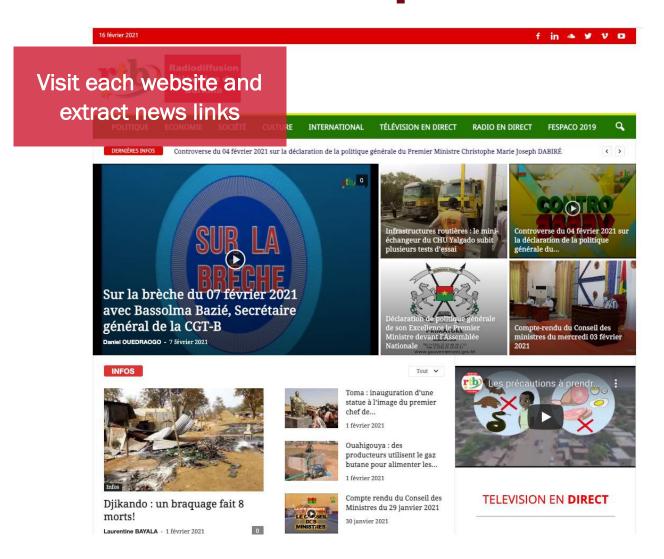


Process - Step 1: Seed Links

Create a list of pages you want to scrape

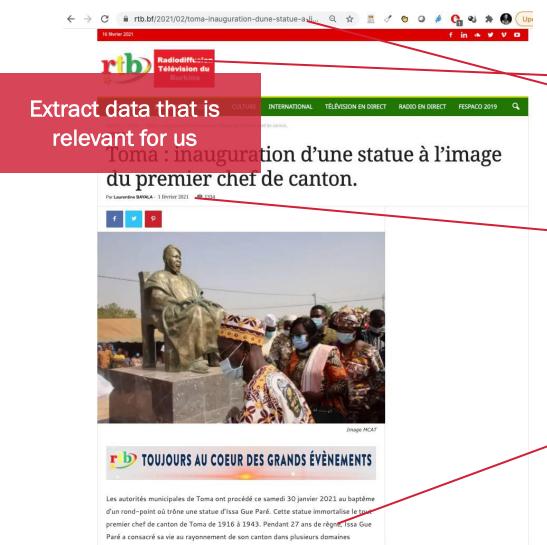
A	В	C	D E	F	G
country_name	▼ country_is ▼	medium_name	alexa_sco v source	J url	▼ news_site -
Burkina Faso	BF	http://www.aib.media	NA xyzlinks	http://www.aib.media	TRUE
Burkina Faso	BF	http://www.aouaga.com	NA xyzlinks	http://www.aouaga.com	TRUE
Burkina Faso	BF	http://www.aujourd8.net	NA xyzlinks	http://www.aujourd8.net	TRUE
Burkina Faso	BF	http://www.burkina24.com	NA xyzlinks	http://www.burkina24.com	TRUE
Burkina Faso	BF	http://www.burkinainfo.com	NA xyzlinks	http://www.burkinainfo.com	TRUE
Burkina Faso	BF	http://www.faso-actu.net	NA xyzlinks	http://www.faso-actu.net	TRUE
Burkina Faso	BF	http://www.fasopresse.net	NA xyzlinks	http://www.fasopresse.net	TRUE
Burkina Faso	BF	http://www.fasozine.com	NA xyzlinks	http://www.fasozine.com	TRUE
Burkina Faso	BF	http://www.leconomistedufaso.bf	NA xyzlinks	http://www.leconomistedufaso.bf	TRUE
Burkina Faso	BF	http://www.lefaso.net	NA xyzlinks	http://www.lefaso.net	TRUE
Burkina Faso	BF	http://www.lepays.bf	NA xyzlinks	http://www.lepays.bf	TRUE
Burkina Faso	BF	http://www.lepays.bf	NA xyzlinks	http://www.lepays.bf	TRUE
Burkina Faso	BF	http://www.lesaffairesbf.com	NA xyzlinks	http://www.lesaffairesbf.com	TRUE
Burkina Faso	BF	http://www.lexpressdufaso-bf.com	NA xyzlinks	http://www.lexpressdufaso-bf.com	TRUE
Burkina Faso	BF	http://www.lobservateur.bf	NA xyzlinks	http://www.lobservateur.bf	TRUE
Burkina Faso	BF	http://www.lobservateur.bf	NA xyzlinks	http://www.lobservateur.bf	TRUE
Burkina Faso	BF	http://www.monpulsar.com	NA xyzlinks	http://www.monpulsar.com	TRUE
Burkina Faso	BF	http://www.mutationsbf.info	NA xyzlinks	http://www.mutationsbf.info	TRUE
Burkina Faso	BF	http://www.omegabf.info	NA xyzlinks	http://www.omegabf.info	TRUE
Burkina Faso	BF	http://www.ouagafm.bf	NA xyzlinks	http://www.ouagafm.bf	TRUE
Burkina Faso	BF	http://www.radiob24.com	NA xyzlinks	http://www.radiob24.com	TRUE
Burkina Faso	BF	http://www.rtb.bf	NA xyzlinks	http://www.rtb.bf	TRUE
Burkina Faso	BF	http://www.savanefm.bf	NA xyzlinks	http://www.savanefm.bf	TRUE
Burkina Faso	BF	http://www.sidwaya.info	NA xyzlinks	http://www.sidwaya.info	TRUE
Burkina Faso	BF	http://www.sidwaya.info	NA xyzlinks	http://www.sidwaya.info	TRUE
Burundi	ВІ	http://www.abpinfos.com	NA xyzlinks	http://www.abpinfos.com	TRUE
Burundi	BI	http://www.arib.info	NA xyzlinks	http://www.arib.info	TRUE
Burundi	BI	http://www.burundi24.wordpress.com	NA xyzlinks	http://www.burundi24.wordpress.com	TRUE
Burundi	BI	http://www.burundi-agnews.org	NA xyzlinks	http://www.burundi-agnews.org	TRUE
Burundi	BI	http://www.burundi-eco.com	NA xyzlinks	http://www.burundi-eco.com	TRUE
Burundi	BI	http://www.burundi-forum.org	NA xyzlinks	http://www.burundi-forum.org	TRUE
Burundi	ВІ	http://www.burundi-information.net	NA xyzlinks	http://www.burundi-information.net	TRUE
Burundi	ВІ	http://www.fr.itaraburundi.com	NA xyzlinks	http://www.fr.itaraburundi.com	TRUE
Burundi	BI	http://www.isanganiro.org	NA xyzlinks	http://www.isanganiro.org	TRUE
Burundi	BI	http://www.itaraburundi.com	NA xyzlinks	http://www.itaraburundi.com	TRUE
Burundi	ВІ	http://www.iwacu-burundi.org	NA xyzlinks	http://www.iwacu-burundi.org	TRUE
n	DI.	Lat. 11 L	NA	Lan. D toward Land at the	TRUE

Process – Step 2: Retrieve links



Link	URL
Toma: inauguration d'une statue à l'image du premier chef de	https://www.rtb.bf/2021/02/tom a-inauguration-dune-statue-a- limage-du-premier-chef-de- canton/
Ouahigouya : des producteurs utilisent le gaz butane pour alimenter les	https://www.rtb.bf/2021/02/oua higouya-des-producteurs-utilisent- le-gaz-butane-pour-alimenter-les- motopompes/
Compte rendu du Conseil des Ministres du 29 janvier 2021	https://www.rtb.bf/2021/01/com pte-rendu-du-conseil-des- ministres-du-29-janvier-2021/
Compte-rendu du conseil des ministres du vendredi 29 janvier 2021	https://www.rtb.bf/2021/01/com pte-rendu-du-conseil-des- ministres-du-vendredi-29-janvier- 2021/

Process - Step 3: Extracting data



publish_date	source	country_iso	full_text =	web_url **
2020-04-07	abidjan.net	CI	Société Hamed Bakayoko déclaré positif au coronaviru	https://news.abidjan.net/h/671218.html
2020-04-27	abidjan.net	CI	Société COVID 19: Un don en vivres et non vivres offe	https://news.abidjan.net/h/672003.html
2020 04 20	abidjan.net	CI	Économie Covid-19: le directeur général de IOMS peu	https://news.abidjan.net/h/671694.html
2020-04-22	abidjan.net	CI	Économie Hausse du coût de la viande : les acteurs in	https://news.abidjan.net/h/671803.html
2020-04-29	abidjan.net	CI	Société Secteur du tourisme et des loisirs : les résulta	https://news.abidjan.net/h/672090.html
2020-03-21	abidjan.net	CI	Économie Covid-19: Les mesures urgentes prises par	https://news.abidjan.net/h/670625.html
2020-03-23	abidjan.net	CI	Société Journée mondiale de l'eau 2020 toujours d'ac	https://news.abidjan.net/h/670673.html
2020-03-27	abidian.net	CI	International New York, nouvel épicentre de la pandé	https://news.abidjan.net/h/670803.html
2020-05-06	abidjan.net	CI	Société Ramadan : Hamed Bakayoko offre des vivres a	https://news.abidjan.net/h/672361.html
2020-05-12	abidjan.net	CI	Société Coronavirus : Le Premier Ministre met la minis	https://news.abidjan.net/h/672617.html
2020-05-14	abidjan.net	CI	Société Reprise des travaux de la Nationale A3 à Niak	https://news.abidjan.net/h/672735.html
2020-05-27	abidjan.net	CI	Politique Présidentielle 2020: la révision de la liste éle	https://news.abidjan.net/h/673528.html
2020-02-27	abidjan.net	CI	1	https://news.abidjan.net/h/669714.html
2020-04-03	abidjan.net	CI	Économie Covid- 19 Des producteurs de café-cacao r	https://news.abidjan.net/h/671048.html
2020-04-05	abidjan.net	CI	Société Le préfet de Korhogo appelle la population à s	https://news.abidjan.net/h/671111.html
2020-04-10	abidjan.net	CI	Région COVID-19 : Agboville lance la phase répressiv	https://news.abidjan.net/h/671331.html
2020-04-12	abidjan.net	CI	Société Pâques 2020 : LEglise méthodiste plaide pour	https://news.abidjan.net/h/671409.html
2020-04-15	abidjan.net	CI	Art et Culture Covid 19: Des artistes et journalistes se	https://news.abidjan.net/h/671480.html
2020-04-10	abidjan.net	CI	Société Coronavirus : Le centre de dépistage de Yopo	https://news.abidjan.net/h/671348.html
2020-04-04	abidjan.net	CI	Société Covid-19 : Sensibilisation à outrance à lintéri	https://news.abidjan.net/h/671076.html
2020-04-09	abidjan.net	CI	Socité Covid-19: Voici les techniques utilisées par d	https://news.abidjan.net/h/671283.html
2020-04-03	abidjan.net	CI	Société Treichville/ Lutte contre le Coronavirus : le co	https://news.abidjan.net/h/671067.html
2020-04-15	abidjan.net	Cl	Société Covid-19: IÉtat de Côte divoire proroge le dél	https://news.abidjan.net/h/671500.html
2020-04-19	abidjan.net	CI	Société Bruno Koné fait des dons aux ressortissants d	https://news.abidjan.net/h/671672.html
2020-03-06	abidjan.net	CI	Société Social: Report du gala de la Fondation Childre	https://news.abidjan.net/h/670091.html
2020-03-18	abidjan.net	CI	Société Coronavirus: Latelier de formation des format	https://news.abidjan.net/h/670503.html
2020-03-19	abidjan.net	CI	Politique Covid-19: La plateforme pro-Gbagbo, EDS, I	https://news.abidjan.net/h/670561.html
2020-03-17	abidjan.net	CI	Société Crise du Coronavirus : Les Abidjanais vident I	https://news.abidjan.net/h/670484.html
2020-03-27	abidjan.net	CI	Économie Impacts du Covid-19 dans IUEMOA : Avis r	https://news.abidjan.net/h/670824.html
2020-03-26	abidjan.net	CI	Économie Covid-19/Abidjan : Le marché gouro ferme	https://news.abidjan.net/h/670770.html
2020-05-06	abidjan.net	CI	Société Lutte contre le Covid-19: démarrage officiel d	https://news.abidjan.net/h/672345.html
2020-05-04	abidjan.net	CI	Société Ramadan : 400 familles démunies soulagées à	https://news.abidjan.net/h/672295.html
2020-05-10	abidjan.net	CI	Société Lutte contre le Covid-19: les commerçants du	https://news.abidjan.net/h/672540.html
2020-05-13	abidjan.net	CI	Société Des enseignants musulmans offrent des kits a	https://news.abidjan.net/h/672674.html
2020-05-12	abidjan.net	CI	Société Covid-19: des équipements sanitaires offerts	https://news.abidjan.net/h/672628.html
2020-05-20	abidjan.net	CI	Société Nuit du Qadr: Les musulmans ivoiriens invités,	https://news.abidjan.net/h/673090.html

What does the code look like

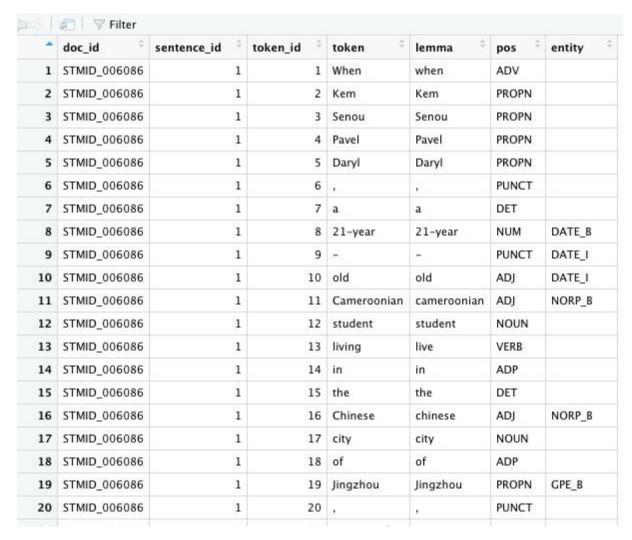
```
##Function: Grab links from initial URLs##
get links <- function(url){
 withTimeout({Sys.sleep(2)
    page <- read html(url)
   web_link <- page %>%
      html nodes("a") %>%
      html_attr("href")
    text_links <- page %>%
      html nodes("a") %>%
      html text()
    tibble(web link,
           text_links,
           url)
  }, timeout = 10, onTimeout = "silent")
###
```

```
##Function: scrapes out text, date, and raw HTML data from a given link##
get_text_from_py <- function(url_link){
 withTimeout({
   traf - import("trafilatura")
   requests - import("requests")
    rand <- import("requests_random_user_agent")
    goose <- import("goose3")
   r <- trafsfetch_url(url_link)
   web_text <- trafsextract(r)
   web_raw1 <- r[1]
   web_date <- trafsmetadata$extract_metadata(r) %>%
     str_extract("[0-9]{4}-[0-9]{2}-[0-9]{2}")
    g = goose$Goose({browser_user_agent = browser_agent})
   article - gSextract(url = url_link)
    web_text2 <- article$cleaned_text</pre>
    web_date2 <- as.character(article$publish_datetime_utc)
    web_raw2 <- article$raw_html
   if (is.null(web_date2) == TRUE){
     web_date2 <- ""
    if (is.null(web_text2) == TRUE){
     web text2 <- ""
   g$close()
   tibble(web_url = url_link,
         web_date = web_date,
         web_date2 = web_date2,
         web_sysdate = Sys.Date(),
         web_text = web_text,
         web_text2 = web_text2,
         web_raw1 = web_raw1,
         web_raw2 = web_raw2)
 }, timeout = 10, onTimeout = "silent")
```

Step 3: Processing the data for analysis

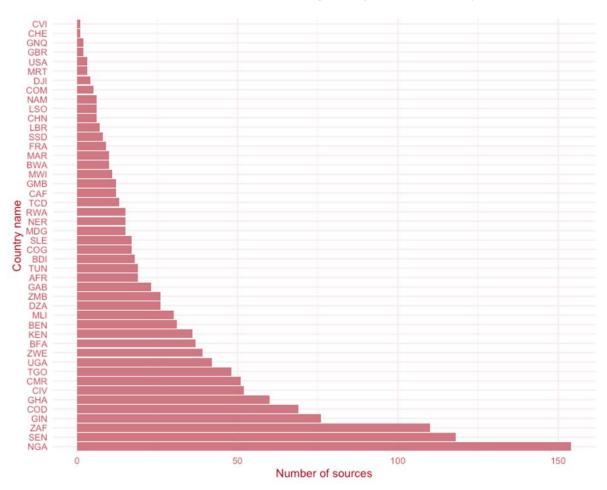
 Use spacy (or udpipe) to tokenize (or lemmatize) the text and POS (part of speech tag)

 We can then remove tokens that we don't "need" (stopwords, numbers, punctuation...)

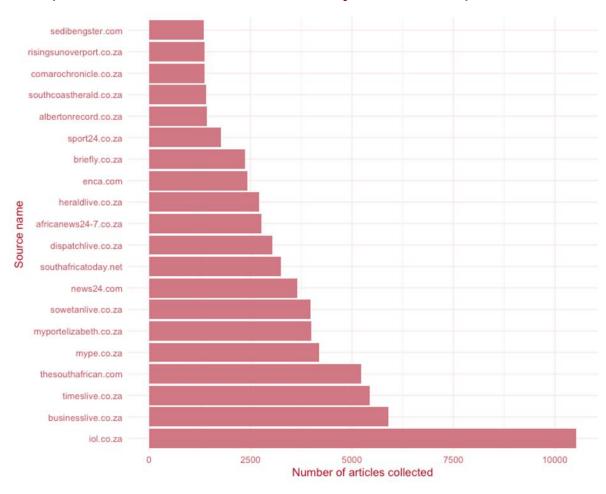


adn Corpus | Content

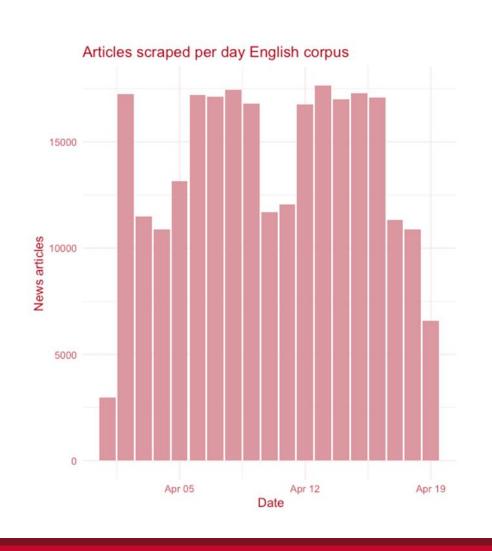
Sources included in the corpus (N = 1,294)

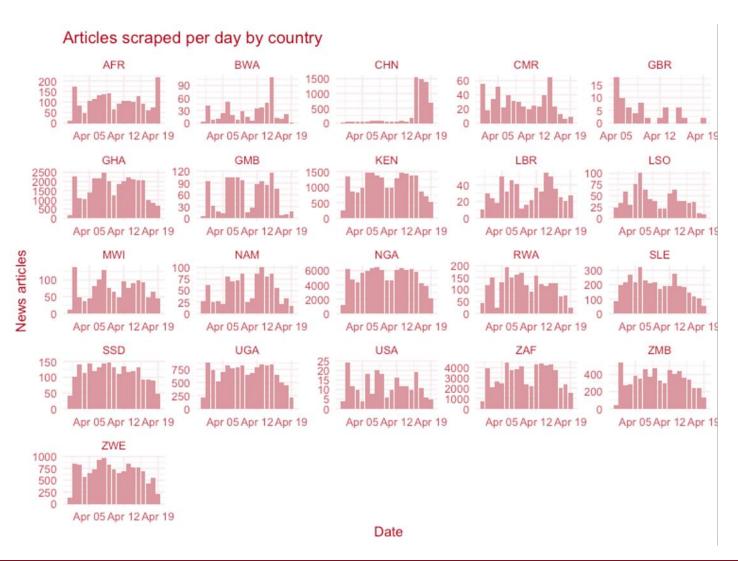


Top 20 South African sources by items scraped



adn Corpus | Content





Limitations

This approach would (in principle) exclude data that is behind paywalls; it is internet data heavy.

 These approaches are heavy on the amount of bandwidth that is required (cloud computing as alternative).

 Downtime of websites and other technical problems might limit how much data we can collect, so it is important to acknowledge biases in our dataset.

Applications

- With large corpora of textual data...
 - We can answer descriptive questions about content
 - We can answer questions about linguistic patterns
 - We can compare sources across geographic spaces
 - We can trace longitudinal patterns
 - We can triangulate text data with fieldwork

More information

There's more details on the process in a paper that came out last year

Madrid-Morales, D. (2020). Using Computational Text Analysis Tools to Study African Online News Content. African Journalism Studies, 41(4), 68-82. https://doi.org/10.1080/23743670.2020.1820885

Data from a pilot study of the adn corpus can be downloaded from Madrid-Morales, D., Lindner, P., & Periyasamy, M. (2021). Corpus of African Digital News from 600 Websites Formatted for Text Mining / Computational Text Analysis [Data set]. Texas Data Repository.

https://doi.org/10.18738/T8/UKJZ3E

Revisiting News Flows



Global News Flows

- The impact that global news agencies from the Global North have on the news content of media in the Global South has long been a preoccupation of scholars of global communication since Cold War.
- Spurred by the arrival of Qatar's Al Jazeera in the 2000s, there's been an increasing interest in the possible impact of State-owned media on global news narratives.
 - These State-owned/backed media include China's and Russia's, but also France's and others'.
 - Chinese media's actual influence on African media is poorly understood.

Intermedia agenda setting

- The ability of well-established news organizations to have an impact on the content of smaller or less-established news organizations (McCombs, 2004).
- Guo and Vargo (2020, p. 3) use the term "transnational intermedia agenda setting" to refer to
 - the ability of news media in a country to "transfer the salience of issues associated with their own country to foreign media, thus influencing how foreign media portray the country"
 - "the capability of a country's news media to push their perspectives on international politics outside of their own country to the world".

Background





Research Questions

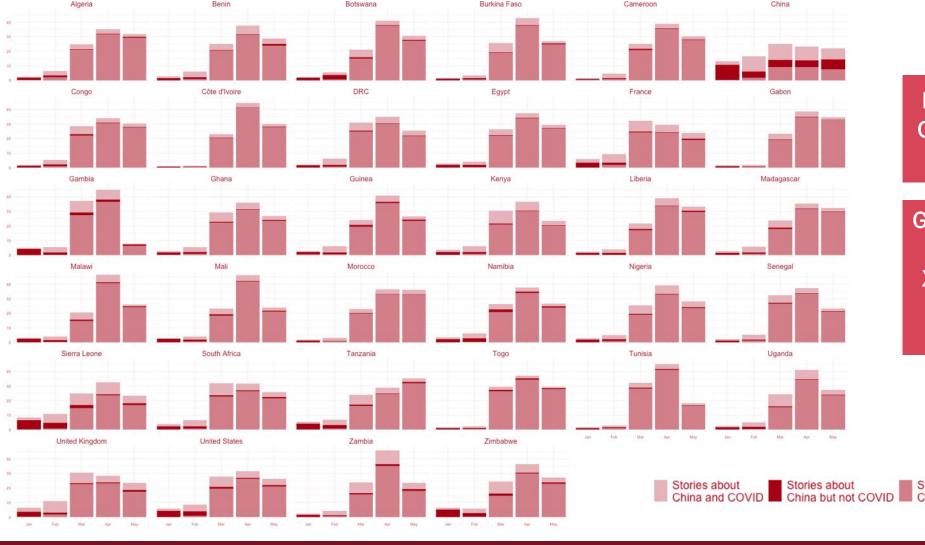
- RQ1: How prevalent were news stories about China and COVID-19 in African media between January and May 2020?
- RQ2: How much content from global media did African news organizations reuse in their reporting of the COVID-19 outbreak?
- RQ3: To what extent was the reuse of Chinese media's content different in Francophone and Anglophone Africa?
- RQ4: How much of China's narrative during the crisis was reflected on African media's coverage of the pandemic?

Analysis

Compiled 500,000 news stories from French & English language digital sources based in Africa (16 French- and 16 English-speaking) & UK, France, US, China.

- Approach 1: Use word frequencies to compare texts and find how similar they are
 - RNewsFlow
 - Cosine similarity > .97
- Approach 2: Use word frequencies (and metadata) to classify documents into N topics.
 - stm

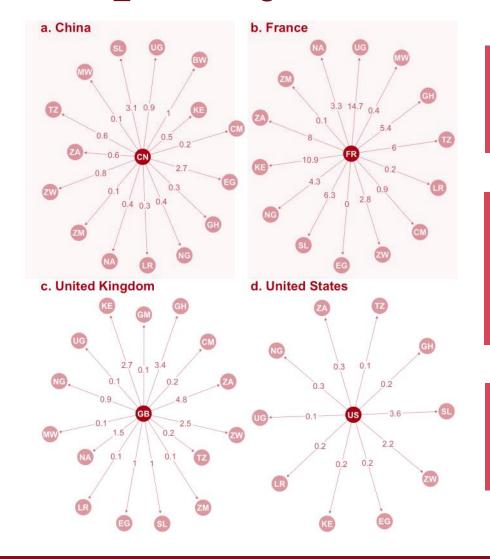
RQ₁: Amount Coverage about China & COVID



Limited news about China pre-COVID-19; peaked in April

Global media discuss
China more
XH 225 stories/day
Reuters: 135/day
Average: 1.2/day

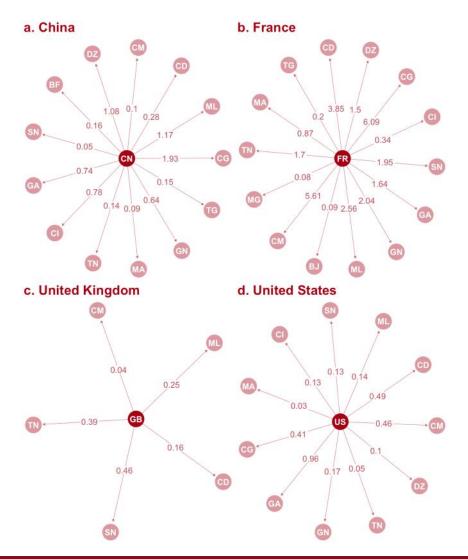
RQ₂ & RQ₃: Quantifying Text Reuse



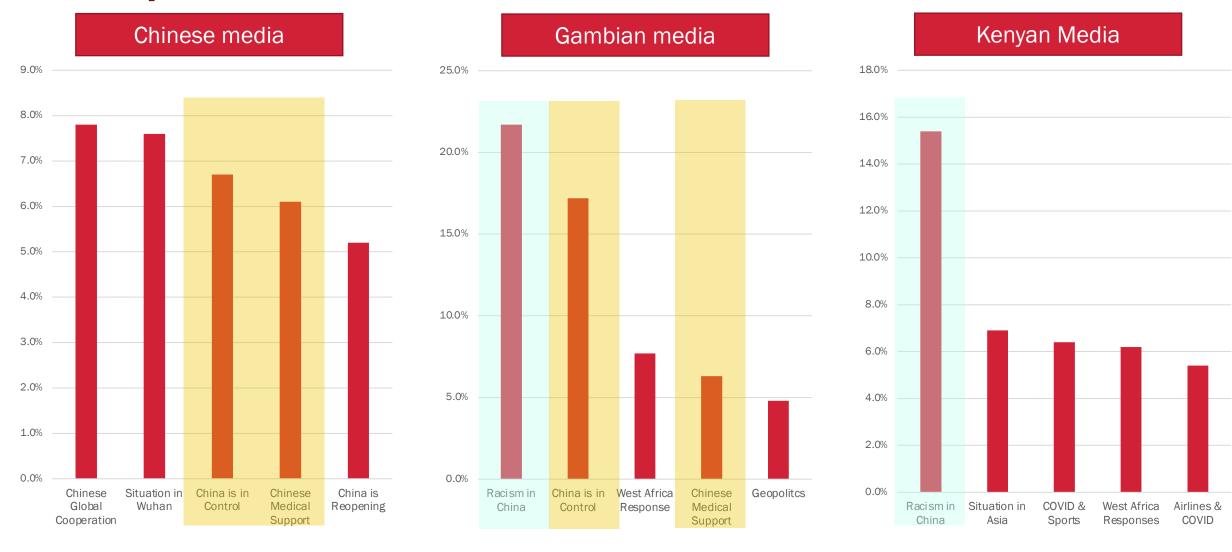
Around 4% of stories were from foreign sources (AFP, 1st).

News on China and COVID came from FR (65%), UK (25%) & CN (7%) sources.

More reliance on text reuse on English (<=) that French (=>)



RQ₄: Narrative overlap



Final Ideas I

- This paper found limited evidence of transnational intermedia agenda setting:
 - News coverage of China in most African countries tends to be relatively modest when no significantly newsworthy "news event" is taking place
 - The use of content published originally by Chinese sources is very marginal in both English and French-speaking Africa
 - There is a gap between the prevailing themes found in news coverage about China and COVID-19 in Chinese & African media.

Final Ideas II

- Possible explanations:
 - Existing mistrust among some journalists in Africa towards Chinese media's content (maybe increased during COVID-19)
 - Preference for domestic issues during a pandemic, which might not be covered by Chinese sources.

More information

• (Some of the) data and the code for this study is available in this repository:

https://github.com/danimadrid/africa_china_covid19

A paper detailing some of these findings is press:

Madrid-Morales, D. (2021). Who Set the Narrative? Assessing the Influence of Chinese Global Media on News Coverage of COVID-19 in 30 African Countries. *Global Media and China*, 6(2).

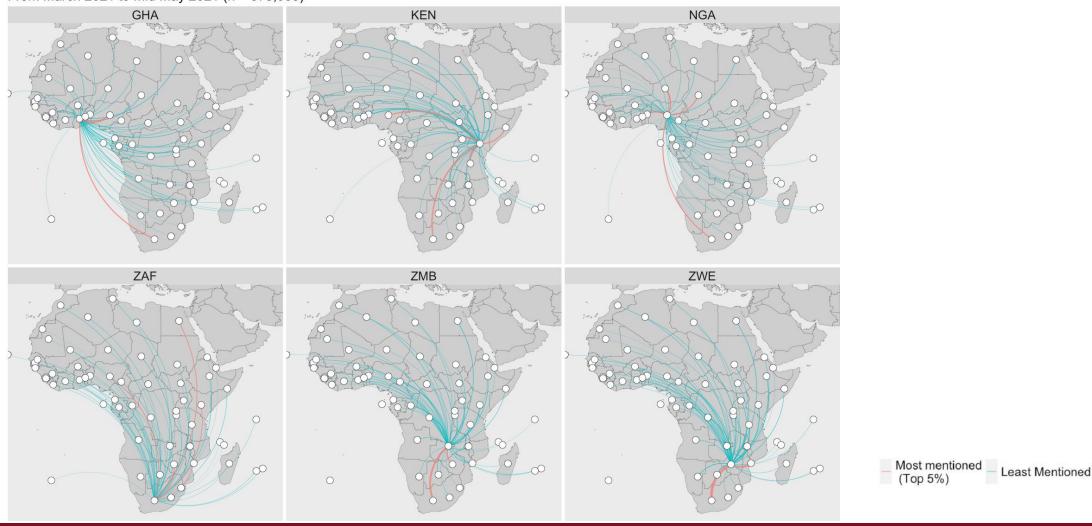
https://doi.org/10.1177/20594364211013714

Revisiting "Foreign News"



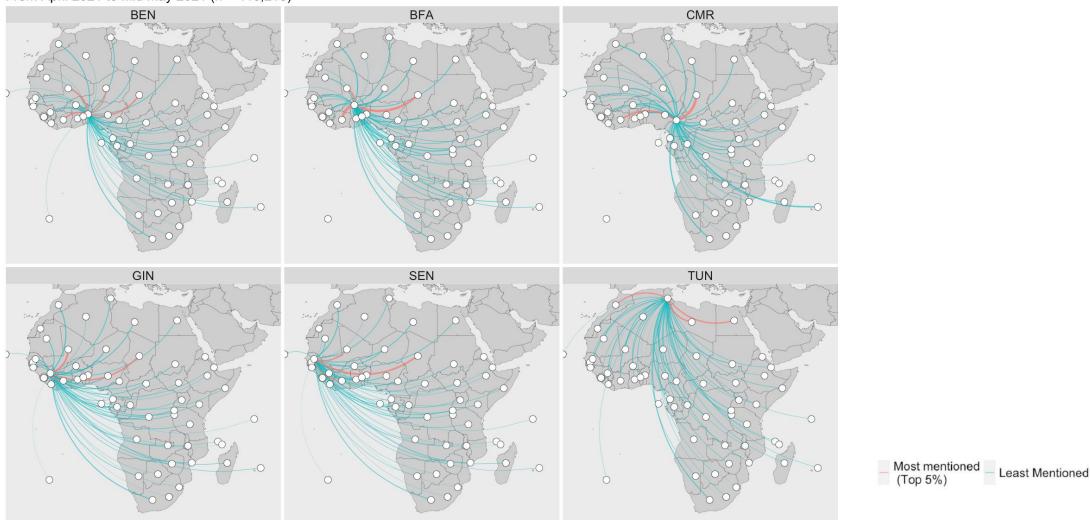
African media covering African news

Frequency of country mentions in the media of selected countries (English corpus) From March 2021 to Mid May 2021 (n = 573,039)



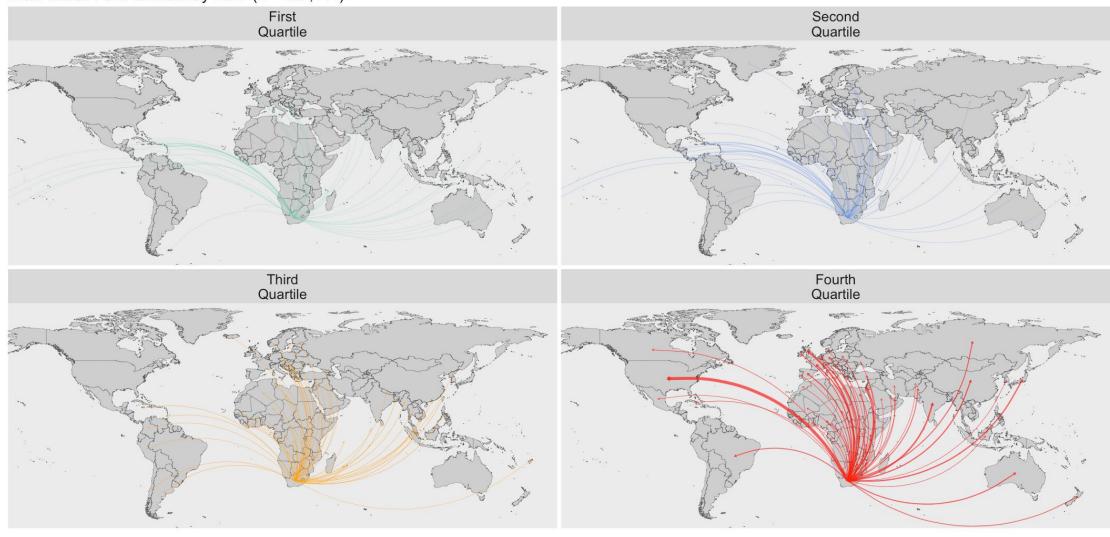
African media covering African news

Frequency of country mentions in the media of selected countries (French corpus) From April 2021 to Mid May 2021 (n = 413,213)



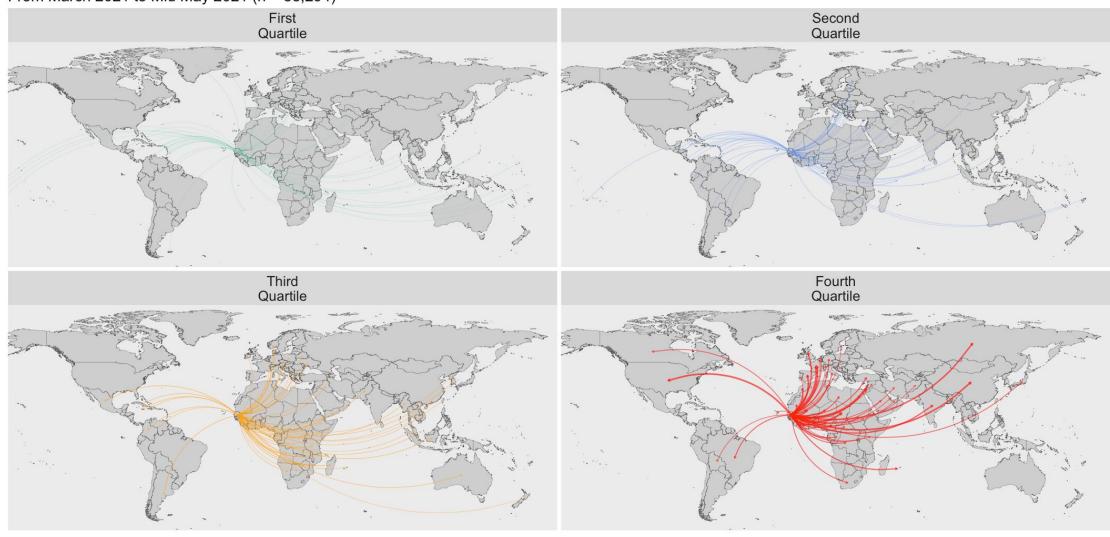
South African media covering the World

From March 2021 to Mid May 2021 (n = 127,141)



Senegalese media covering the World

From March 2021 to Mid May 2021 (n = 88,294)



Next stages for adn

Pilot study with English text [2019]

Beta version of multilingual database [current]

Launch production stage [June 2021]

Opening access to monitor corpus to users [September 2021]

Data processing and insights [pending funding]

Q&A



Old Questions, Big Data: Using the African Digital News (ADN) Corpus to Study News **Flows**

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