

### News Media in the Digital Age Was dürfen wir glauben? Methoden und Maschinen für die

Bewertung des Wahrheitsgehalts von Behauptungen

F3-Fighting Fake Facts, 04/02/2019, Basel

Karl Aberer, Distributed Information Systems Laboratory, EPFL karl.aberer@epfl.ch



- Main Trends
- Bias
- Fake News (in Science)



# Main trends

### News Media today

News media play an ever increasing important role in today's society

- Positive: critical information source for enterprises and administration
- Negative: Fake news, political influencing





### News Media in the Digital Age - Main Trends

### The consumption of media is changing

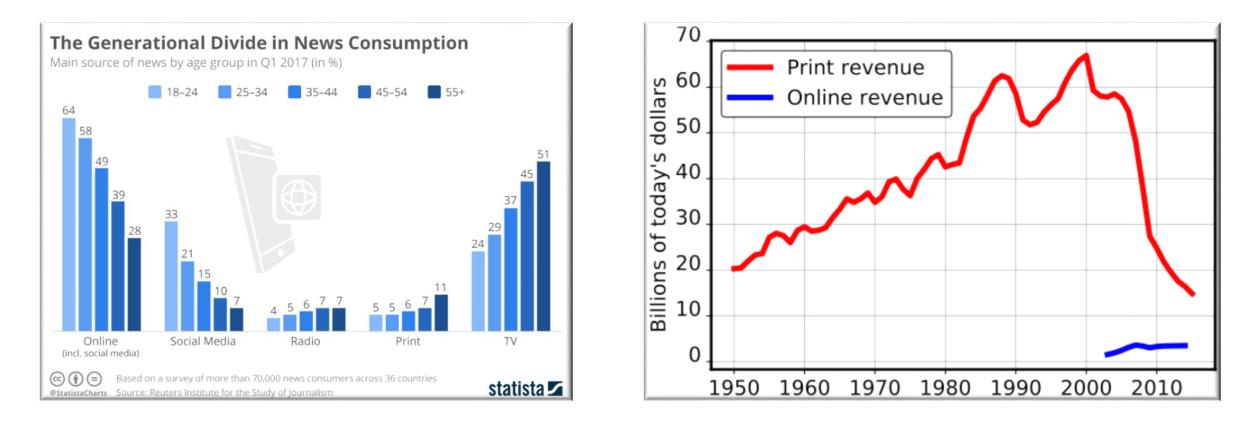
- Young people consume news from social media
- Changing business models due to digitalization

### The **production** of media is changing

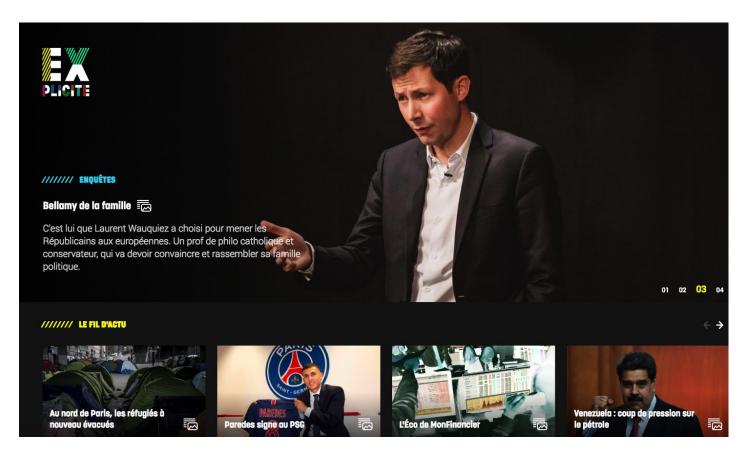
- Social media (Twitter) and open data become essential sources for journalists
- Use of artificial intelligence tools in media production

# Changing News Media Consumption

### Young Generation consumes news from Social Media



### Alternative Media Channels

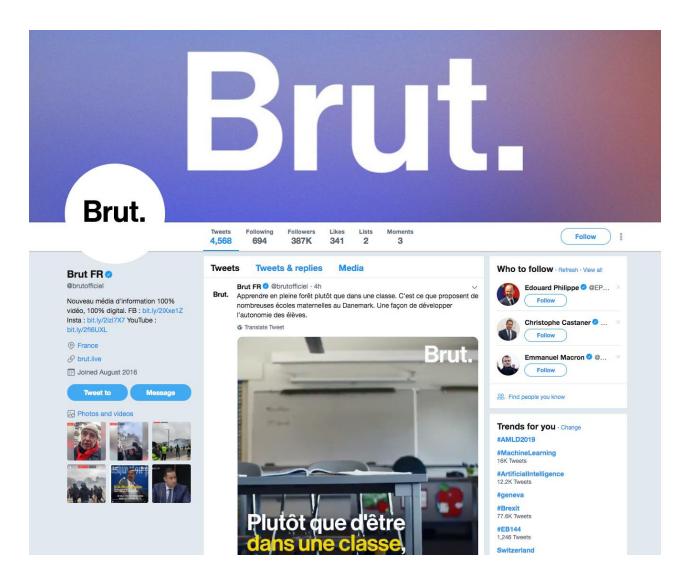


#### Renegade journalists

150k crowd-funding Diffusion on social media Independence

https://www.explicite.info/

### Alternative Media Channels



#### News channel

100% Video 100% Twitter

https://twitter.com/brutofficiel

# Changing Business Models

### 7 business models that could save the future of journalism

by MANDLA CHINULA . Jun 19 in MEDIA ENTREPRENEURSHIP

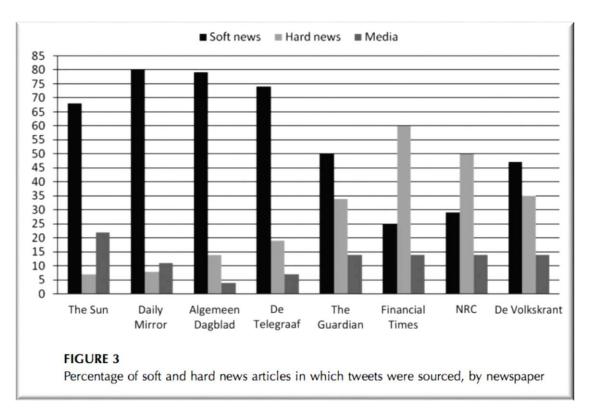


- Sponsored Content
- Crowd-Funding
- Subscriptions
- Micro payments
- Donor funding
- Live Journalism
- Quality journalism

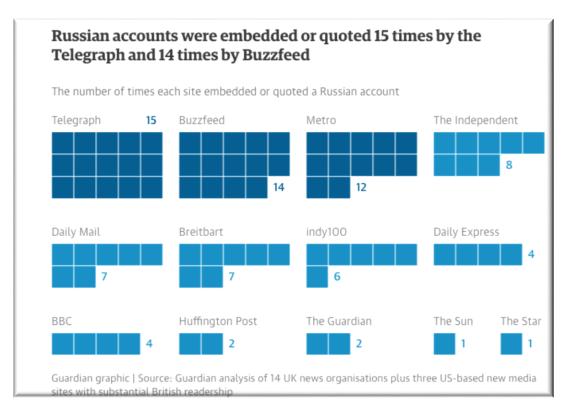
"Investigative journalism also drives advertising. It's what elevates our brand," said Jed Hartman, The Washington Post's chief revenue officer

### **Changing Information Sourcing by Journalists**

#### Data from 2011



#### ... and possible consequences



https://www.tandfonline.com/doi/pdf/10.1080/17512786.2013.802481?needAccess=true

### Use of Al in Journalism

Liberate journalists from performing routine tasks (sifting through digital information) to free time for quality journalism



**Information Sourcing** 

#### **Text Generation**

**Image Search** 

Examples: Tamedia

# Bias and diversity



Bias is the result of an information selection mechanism that makes the information "non-representative" of the "reality"

Different mechanisms

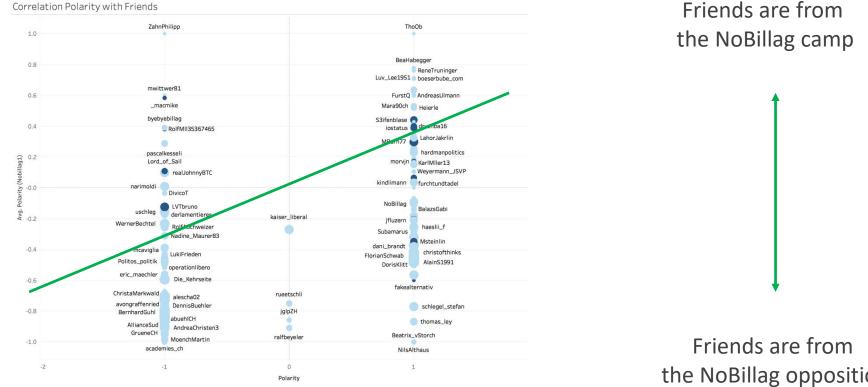
- Selection by authors
- Selection by readers
- Selection by intermediaries (algorithms!)

Considered as "bad"

- Echo chambers, Filter bubbles
- Contributes to polarization in the population
- Subtle form of misrepresenting reality

# Echo Chambers

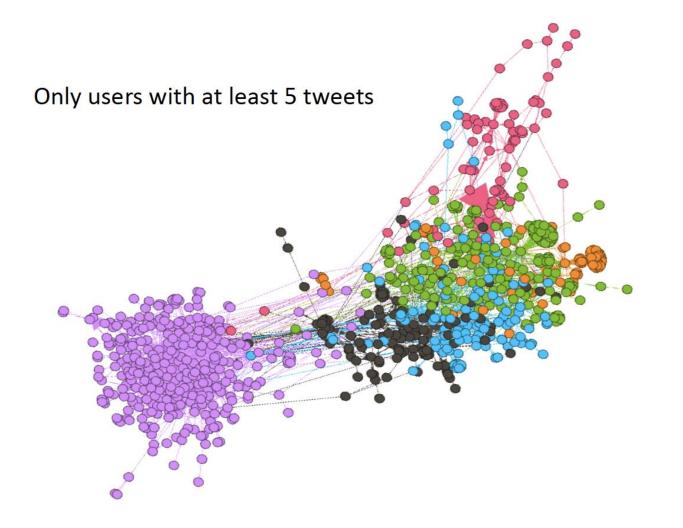
#### Popular accounts from the Nobillag vote



#### Authors that are rather against NoBillag

Authors that are rather for NoBillag the NoBillag opposition

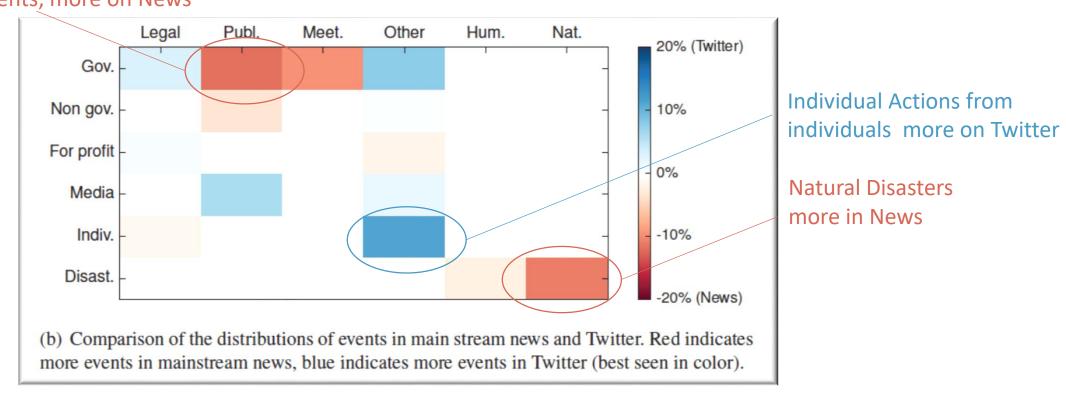
### Echo Chambers: Influencers



# **Channel Bias**

#### Events related to Climate Change in News and Twitter

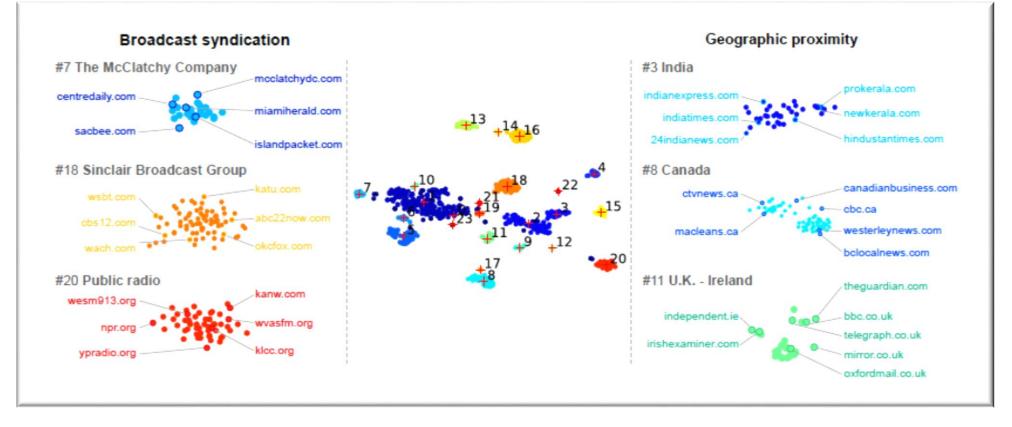
### Publications, meetings and legal documents from governments, more on News



Olteanu, A., Castillo, C., Diakopoulos, N., & Aberer, K. (2015). Comparing events coverage in online news and social media: The case of climate change. In *Proceedings of the Ninth International AAAI Conference on Web and Social Media*.

### Syndication Bias

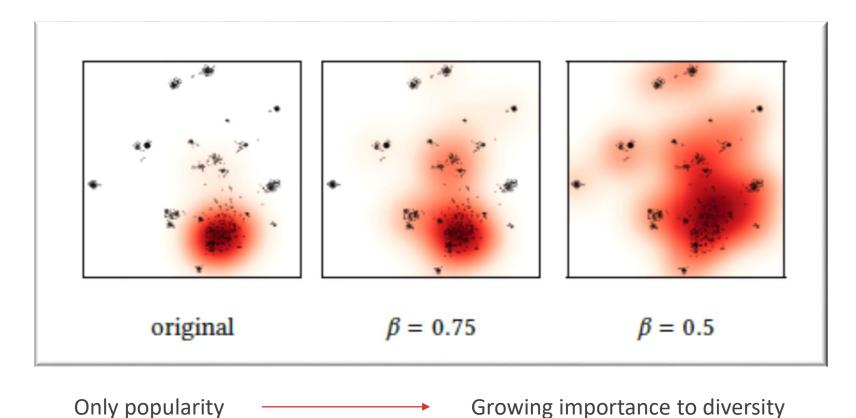
### Media channels characterized (and clustered) by the events they cover reveals the structure of the large media conglomerates



Bourgeois, D., Rappaz, J., & Aberer, K. (2018, April). Selection Bias in News Coverage: Learning it, Fighting it. In *The International World Wide Web Conference 2018.* 

# Fighting Syndication Bias

Select sources by popularity or by maximizing diversity (conflicting criteria!)





Fake

### Propaganda

forseeeble future.

### Also in Europe



What can we learn today from the Three wise men'T

#### Baltics battle Russia in online disinformation war

From the backing attack on Estonia in 2007 to the fake news targeting the NATO battalions on the alliance's eastern border in 2017 — the Baltic states have been the bull'seye of Russian-backed digital warfare.



# Selective Perception of Science Studies

Science: different views on the same abortion study

- Shocking Figures Show New York City's Abortion Rate is 60% of Its Birth Rate (lifenews.com)
- CDC Report: 35% of Aborted Babies are Black American Babies (blacklivesmatterexposed.com)
- How These Groups Plan to Combat the High Rate of Abortion Among Blacks (blackcommunitynews.com)
- CDC reports decline in number, rate of abortion (womenshealthpolicyreport.org)
- CDC Releases Mind Blowing NYC Abortion Numbers (truthkings.com)
- Obamacare and prochoice policies help reduce abortion rate to pre-Roe levels; lowest in 45 years (dailykos.com)
- Whittling Away Abortion Access (NY Times opinion)

### **Boosting Bad Science**

By PAULA COHEN / CBS NEWS / May 29, 2015, 5:00 AM

### How the "chocolate diet" hoax fooled millions

f Share / 🎔 Tweet / 🌝 Reddit / 📭 Flipboard / @ Email

Last Updated May 29, 2015 5:23 PM EDT

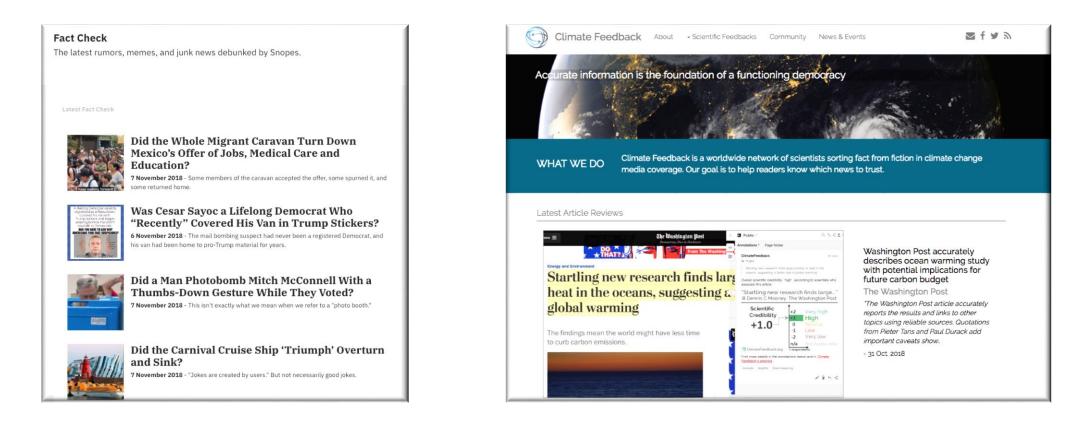
Eating chocolate every day can help you lose weight? If it sounds too good to be true -- that's because the chocolate diet study that made headlines around the world last year was all an elaborate hoax.

Now those responsible are going public with the story behind the bogus diet study and the media frenzy that followed. It was a carefully planned effort to expose the prevalence of junk science and unchecked, hype-driven press coverage.

https://www.cbsnews.com/news/how-the-chocolate-diet-hoax-fooled-millions/

# Credibility Evaluation Today

### Manual fact checking by experts



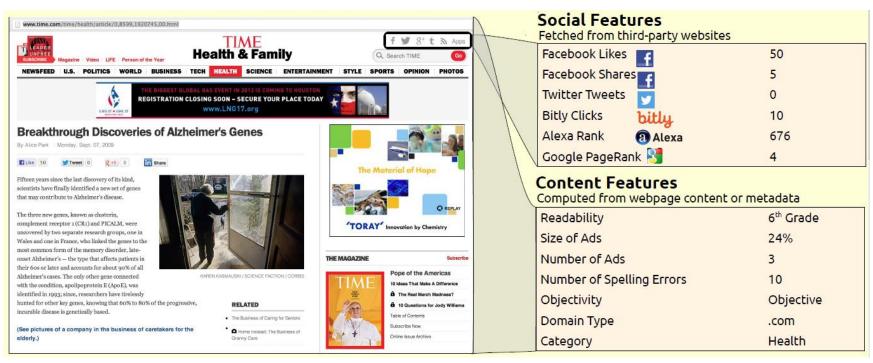
#### General Fact Checking Sites (mostly journalists)

Specialized Science Fact Checking Sites (mostly scientists)

# Automated Web Credibility Evaluation?

Insights

- There exist features that correlate with credibility
- Combination of content and social features works best
- Quality of classification depends on quality of training data = ground truth

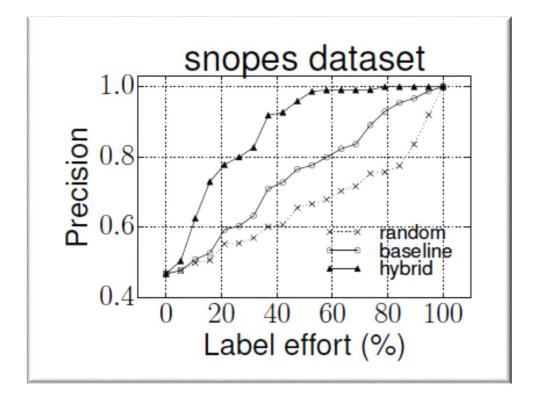


Olteanu, A., Peshterliev, S., Liu, X., & Aberer, K. (2013, March). Web credibility: features exploration and credibility prediction. In *European conference on information retrieval* (pp. 557-568). Springer, Berlin, Heidelberg.

# Amplifying Expert Feedback

Minimizing labelling effort by presenting good examples to experts

 20% of manual labels (ground truth) allow to predict 80% of unknown labels correctly



Nguyen, T. T., Phan, T. C., Nguyen, Q. V. H., Aberer, K., & Stantic, B. (2019). Maximal fusion of facts on the web with credibility guarantee. *Information Fusion*, *48*, 55-66.

### **SciLens: Evaluating Quality of Scientific News**

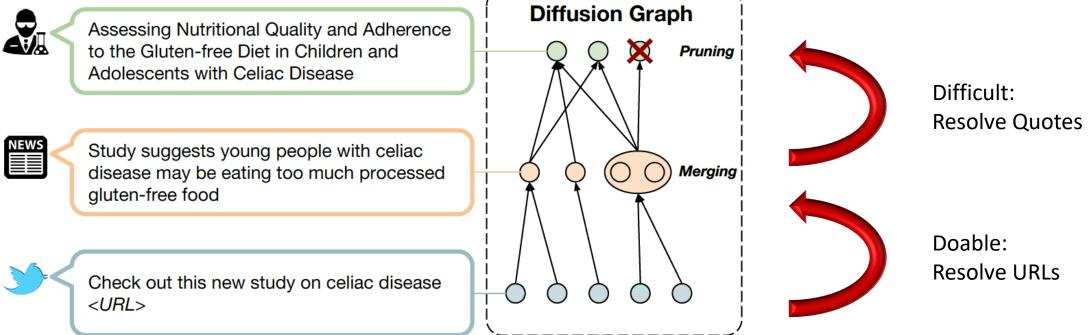
Investigate whether scientific findings are adequately presented in science news.

Data collection: start from social media posts, identify news, find quotations of science articles in the nutrition domain

- 11'000 social media posts
- 7'500 news articles
- 1'300 papers

### Scilens Approach

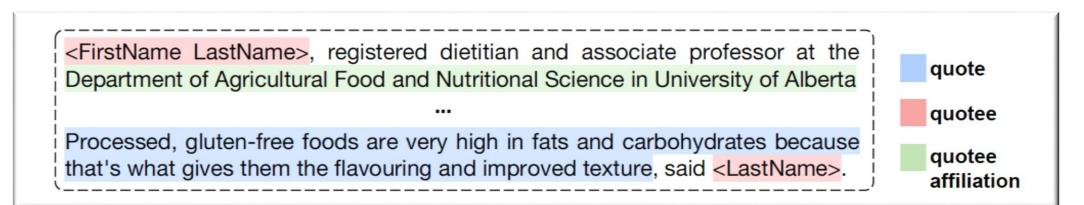




# **Resolving Quotes**

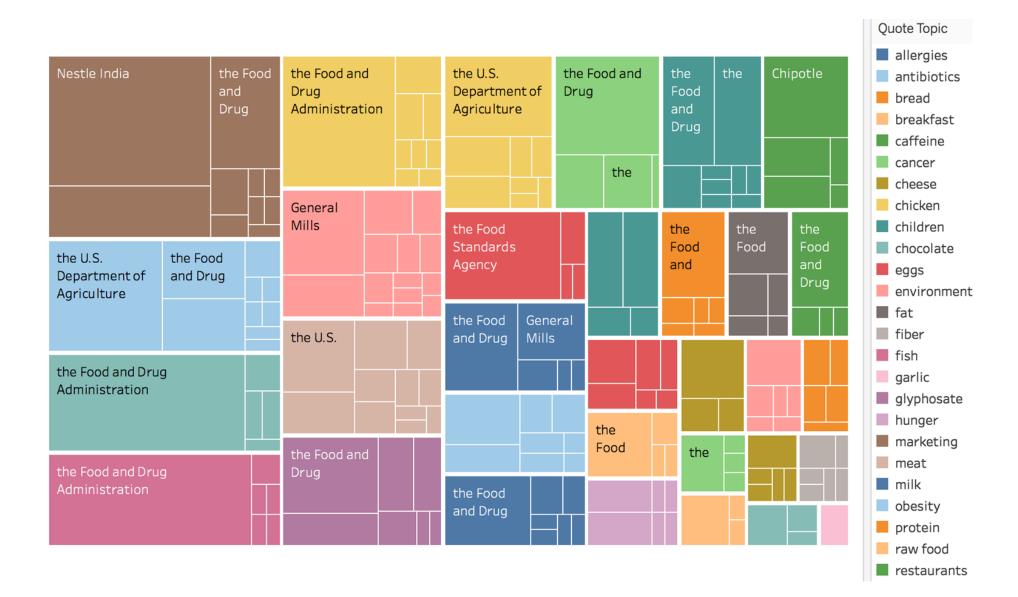
Linking news to science articles: bootstrapping approach

- Create a set of reporting verbs ("say", "claim", "prove",...), studies ("survey", "analysis") and scientists ("researcher", "analyst")
- Extend this set with semantic similar words using word embeddings
- Identify indirect speech using NLP processing
- Build regular expression patterns over word classes



### 90% precision at 50% recall

### Most Quoted Organization per Topic



# Identifying Quality Features

Context	Туре	Indicator
Article	Baseline	Title [Clickbait, Subjectivity, Polarity], Article Readability, Article Word Count, Article Bylined
Alucie	Quote-Based	#Total Quotes, #Person Quotes, #Scientific Mentions, #Weasel Quotes
Sci. literature	Source Adherence	Semantic Textual Similarity
Sci. merature	Diffusion Graph	Personalized PageRank, Betweenness, [In, Out] Degree, Alexa Rank
Social media	Reach	#Likes, #Retweets, #Replies, #Followers, #Followees, [International News, Temporal] Coverage
Social media	Stance	Tweets/Replies [Stance, Subjectivity, Polarity]

#### Should You Be Taking a Curcumin or Turmeric Supplement?

A PLOS ONE study did find, however, that a combination of curcumin and tomatine, an antifungal and anticancer compound in tomatoes, inhibited cell growth of prostate cancer.

Fitness Magazine

#### Combination of α-Tomatine and Curcumin Inhibits Growth and Induces Apoptosis in Human Prostate Cancer Cells

Curcumin and α-tomatine alone or in combination had a small inhibitory effect on the growth of non-tumorigenic prostate epithelial RWPE-1 cells.

#### PLOS ONE

Source adherence: Semantic textual similarity feature for News article

### Non-Expert Evaluation

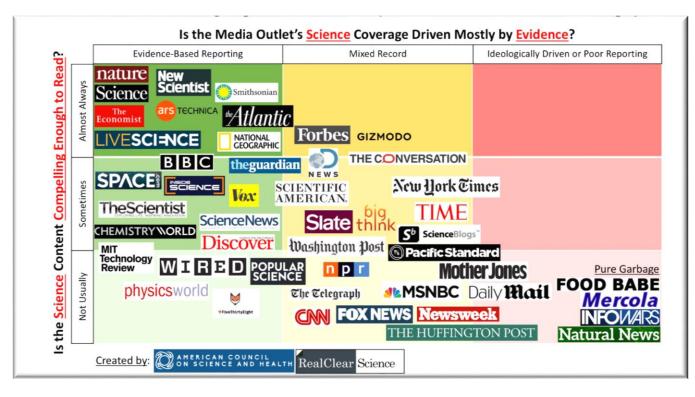
Hypothesis: when non-experts see the quality features they can do a better assessment

Visitors per day of this news website (more visitors = more stars) Mentions of universities and scientific portals (more mentions = more stars) Length of the article (longer article = more stars) Number of quotes in the article (more quotes = more stars) Number of replies to tweets about this article) (more replies = more stars) Article signed by its author (✓ = signed, × = not signed) Sentiment of the article's title (©©= most positive, ©©= most negative)

### Supervision

### Building a machine learning classifier using the quality features

- In absence of ground truth we use weak supervision
- Instead of judging the quality of articles we judge quality of outlet



Expert assessment of quality of journals

### Results

	Experts	Non-Experts		Fully	
	by agreement	#	No ind.	Ind.	automated
ATC	Strong agreement	7	0.80	0.45	1.41
	Weak agreement	12	1.28	1.18	0.76
	Disagreement	1	0.40	1.30	0.00
	All articles	20	1.10	1.00	1.00
CRISPR	Strong agreement	6	1.40	1.17	1.00
	Weak agreement	10	0.86	0.76	0.67
	Disagreement	4	0.96	1.22	1.03
	All articles	20	1.96	0.96	0.85

- When displaying features to non-experts, the quality of their evaluation increases significantly
- A weakly-supervised classifier performs better than non-experts!



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### **EPFL Open Science Champions**

In September 2018, EPFL President Martin Vetterli announced the creation of the <u>Open Science Fund</u> to support the best ideas from everyone on campus with a total of CHF 3 Mio over the period 2019-2021.

#### **Evaluating the Quality of Science News Articles**

In an age of fake news and mistrust towards experts, weeding out misreporting of scientific studies is important. The <u>Distributed</u> <u>Information Systems Laboratory</u> will develop SciLens, a platform that automatically generates indicators using weakly supervised learning, effectively helping non-experts to evaluate more accurately the quality of a science news article.

# Conclusions

- In view of the "credibility crisis" in media we need quality journalism more than ever
- Traditional news media are no longer protected by information monopolies
  - Privileged access to news agencies
  - Information networks
  - Privileged access the readers
- Technology is a means to aid journalists that
  - Relieve them from mundane and trivial information processing tasks
  - Increase their capacity to analyze large bodies of information
  - To focus on their true added value verification and intellectual analysis

### Questions

