

The State of Wikimedia Research: 2022-2023

an Bayer

Tilman Bayer Benjamin Mako Hill

Miriam Redi Wikimania 2023, Singapore -Introduction



Benjar Wikimania 202

I'm BMH and presenting with Tilman Bayer today. Not here today, except in spirit is Miriam, but we owe her enormous credit for her work.

This is not my first time presenting a version of this talk. The first version of this talk was at Wikimania 2008, and it has happened at Wikimania almost every single year since. If you've seen this before, some of this introduction will be getting quite familiar...

So I'm a professor now, but in 2008 I was a graduate student starting to build a career that would involve studying Wikimedia projects and the broader free culture movement.

This talk began as an excuse for me to make sure that I was up to date on Wikimedia research.

- From Mako's Wikimania 2008 submission

- Introduction

Tyr to capaging, defail, and disorbie, from a briefs eye view, the academic tendecape

- Rom Malen Warmania 2008 submostic

- From Malen Warmania 2008 submostic

Back at Wikimania 2008, Mako set out to run a session that would provide a comprehensive literature review of articles in Wikipedia published in the last year. Quote Mako:

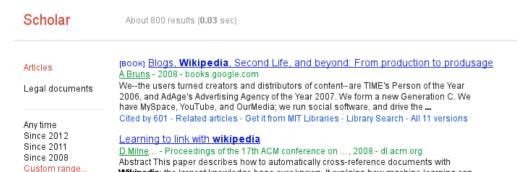
"This talk will try to [provide] a quick tour ... of the last year's academic landscape around Wikimedia and its projects geared at non-academic editors and readers. It will try to categorize, distill, and describe, from a birds eye view, the academic landscape as it is shaping up around our project."

- From Mako's Wikimania 2008 submission

"Then, about two weeks before Wikimania, I did the scholar search so I could build the literature."

"This talk will try to [provide] a quick tour ... of the last year's academic landscape around Wikimedia and its projects geared at non-academic editors and readers. It will try to categorize, distill, and describe, from a birds eye view, the academic landscape as it is shaping up around our project."

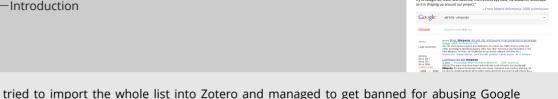




2008 - 2009

Wikipedia: the largest knowledge base ever known. It explains how machine learning can

be used to identify significant terms within unstructured text, and enrich it with links to the ...



"I tried to import the whole list into Zotero and managed to get banned for abusing Google Scholar because they thought that no human being could realistically consume the amount of material published on Wikipedia that year.

So anyway, I had a 45 minute talk so it worked out to 3.45 seconds to per paper...

And believe it or not, this year is even bigger."

"This talk will try to [provide] a quick tour ... of the last year's academic landscape around Wikimedia and its projects geared at non-academic editors and readers. It will try to categorize, distill, and describe, from a birds eye view, the academic landscape as it is shaping up around our project."



D Milne... - Proceedings of the 17th ACM conference on 2008 - dl.acm.org

Abstract This paper describes how to automatically cross-reference documents with

Wikipedia: the largest knowledge base ever known. It explains how machine learning can

be used to identify significant terms within unstructured text, and enrich it with links to the ...

Since 2008

Custom range...

2008 - 2009

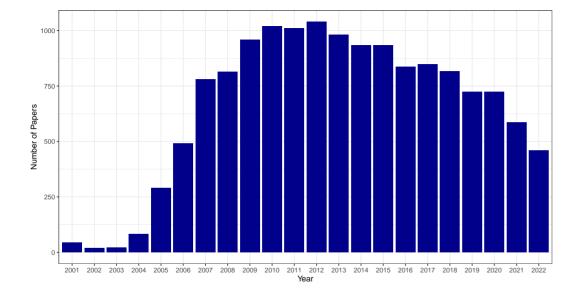
Google attribit widoeda

"I tried to import the whole list into Zotero and managed to get banned for abusing Google Scholar because they thought that no human being could realistically consume the amount of material published on Wikipedia that year.

So anyway, I had a 45 minute talk so it worked out to 3.45 seconds to per paper...

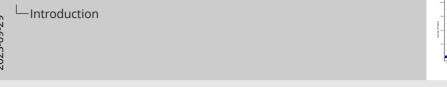
And believe it or not, this year is even bigger."

-Introduction



Number of items, per year, with the term "wikipedia" in the title.

(Source: Google scholar results. Accessed: 2023-08-16)





Academics have written a lot of papers about Wikipedia. There are more than 500 papers published about Wikipedia each year and although we've reached and moved past a peak it seems, it's not slowing by much.

- 81 recent publications covered in the 13 issues of the Wikimedia Research Newsletter from July 2022 to July 2023 (and hundreds more on our to-do list!)
- 86 extended abstracts presented at the Wiki Workshop 2023 in May 2023

—Introduction

 458 tweets from @WikiResearch account on Twitter/X (covering research papers, events, blog posts etc.)

 81 recent publications covered in the 13 issues of the Wikimedia Research Newsletter from July 2022 to July 2023 (and hundreds more on our to-do list!)

 86 extended abstracts presented at the Wiki Workshop 2023 in May 2023

The newsletter aims to be comprehensive, but mostly ignores papers that use Wikipedia as a corpus only (which is popular e.g. in NLP research).

This presentation has multiple issues. Please help <u>improve it</u> by asking questions and making comments along the way.



- This presentation is <u>horribly biased</u>, as it describes the articles that seemed interesting to me.
- The <u>comprehensiveness</u> of this presentation is <u>impossible</u>. Please read the <u>Wikimedia Research Newsletter</u> to get a more complete view.
 (July 2012)

In selecting papers for this session, the goal is always to choose examples of work that:

- Represent important themes from Wikipedia in the last year.
- Research that is likely to be of interest to Wikimedians.
- Research by people who are not at Wikimania.
- ...with a bias towards peer-reviewed publications

—Introduction

2023-09-29



examples of work that:

- Decearch that is likely to be of interest to Wikimedians
- Research that is likely to be of interest to Wikimedians.
- resourch by people with die not at wikiniania.

This is our disclaimer slide...

Within these goals, the selections are incomplete, and wrong.

-Themes and Papers

So the rest of this talk is going to be structured as 7 research postcards. We're going in about 5 minutes:

- Intro a major theme from research in the last year. Something that's new or important in research that want to highlight.
- We're going to introduce and very quickly summarize the paper
- We're going to quickly reflect on why we think this is important or how we think this could impact the Wikimedia community

And we're going to try to do this 7 times.

Speaker: Tilman

The most obvious new theme this year in research is also a theme in research in general, and the world in general, and conference program more broadly...

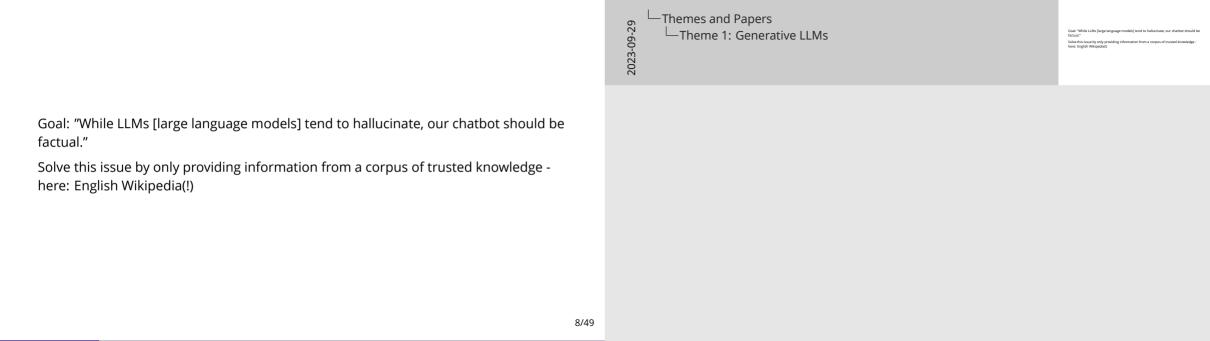
LLM stands for large language models and it's what powers OpenAl's ChatGPT and many other Al applications.

Semnani, Sina J., Violet Z. Yao, Heidi C. Zhang, and Monica S. Lam. 2023. "WikiChat: A Few-Shot LLM-Based Chatbot Grounded with Wikipedia." arXiv. https://doi.org/10.48550/arXiv.2305.14292

-Themes and Papers

Theme 1: Generative LLMs

Theme 1. Generative Al and large language models

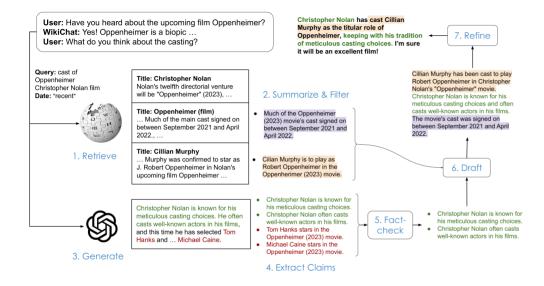


But also: "some chatbots achieve this by presenting factual but unrelated and repetitive information [...] Therefore, we emphasize that conversationality is also important."

-> The team needed to use both output from the LLM itself (to continue the chat in a conversational way) and text retrieved from Wikipedia (for fact-checking purposes)

"We prompt the LLM to generate a response to the history of the conversation. The response often contains interesting and relevant knowledge, but is inherently unreliable. We check their correctness against the knowledge corpus."

Contrast e.g. with the Wikimedia Foundation's new ChatGPT plugin, which focuses only on the second part (retrieve relevant text from Wikipedia, and have the LLM/ChatGPT answer a specific user question based on it)



[Semnani et al., 2023]

Themes and Papers —Theme 1: Generative LLMs



"All WikiChat components, and a sample conversation, edited for brevity. The steps taken to generate a response include 1) retrieval from Wikipedia, 2) summarizing and filtering the retrieved passages, 3) generating a response from an LLM, 4) extracting factual claims from the LLM response 5) fact-checking the claims in the LLM response, 6) drafting a response, and 7) refining the response."

- familiar topics or "head topics" ("Examples include Albert Einstein or FC Barcelona")
- "tail topics" (occurring at lower frequency in the LLMs pre-training data, e.g. Thomas Percy Hilditch or Hell's Kitchen Suomi)
- "recent topics" (which "are absent from the pre-training corpus of LLMs, even though some background information about them could be present. Examples include Spare (memoir) or 2023 Australian Open"), obtained from a list of most edited Wikipedia articles in early 2023.

They criticize previous LLM accuracy evaluations for focusing too much on the familiar "head topics".

☐ Themes and Papers
☐ Theme 1: Generative LLMs

The authors also design a new benchmark to evaluate factual accuracy, focused on three kinds of topics:

familiar topics or "head topics" ("Examples include Albert Einstein or Po

- "tail topics" (occurring at lower frequency in the LLMs pre-training data, e.g. Thomas Percy Hilditch or Hell's Kitchen Suomi)
- "recent topics" (which "are absent from the pre-training corpus of LLMs, even though some background information about them could be present. Example include Spare (memorily or 2023 Australian Open"), obtained from a list of mos edited Wikioedia articles in early 2023.

They criticize previous LLM accuracy evaluations for focusing too much on the familie "head topics". "We find that WikiChat outperforms all baselines in terms of the factual accuracy of its

claims, by up to 12.1%, 28.3% and 32.7% on head, recent and tail topics, while matching GPT-3.5 in terms of providing natural, relevant, non-repetitive and

benchmark") and GPT-3.5 (while ChatGPT is or has been based on GPT-3.5 too. it

involved extensive additional finetuning by humans).

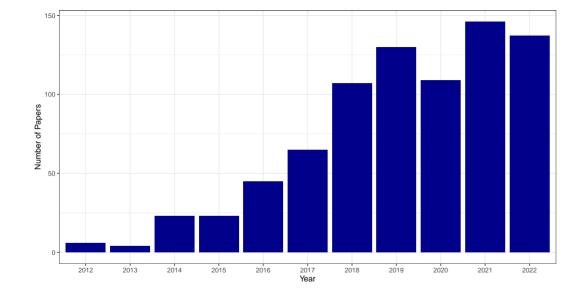
on a retrieval-augmented language model that is "state-of-the-art [...] on the KILT benchmark") and GPT-3.5 (while ChatGPT is or has been based on GPT-3.5 too, it inunived extensive additional finetuning by humans)

This got on the Hacker News frontpage

NB: The comparison did not include widely used chatbots such as ChatGPT or Bing Al. Instead, the authors chose to compare their chatbot with Atlas (describing it as based on a retrieval-augmented language model that is "state-of-the-art [...] on the KILT

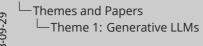
informational responses."

-Themes and Papers

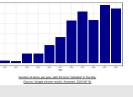


Number of items, per year, with the term "wikidata" in the title.

(Source: Google scholar results. Accessed: 2023-08-16)



13/49



And you probably won't be shocked to hear that it's Wikidata.

This is a version of the graph that I showed you before but for Wikidata.

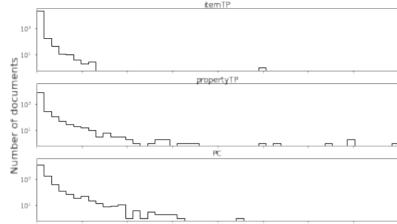
But nearly all of these analyses are in work on knowledge graphs and ontology management and semantic web and they are interested in Wikidata as a database and a source of data.

Theme 2. Wikidata as a community

Koutsiana, Elisavet, Gabriel Maia Rocha Amaral, Neal Reeves, Albert Meroño-Peñuela, and Elena Simperl. 2023. "An Analysis of Discussions in Collaborative Knowledge Engineering through the Lens of Wikidata." *Journal of Web Semantics*, July 2023. https://doi.org/10.1016/j.websem.2023.100799

This is a group of folks who have been publishing on Wikimedia projects, and Wikidata in particular, for a number of years and have made at least one previous appearance in this talk.

Themes and Papers



Number of posts in a document Histograms (y-axis is log-transformed) of item talk pages (itemTP), property talk page

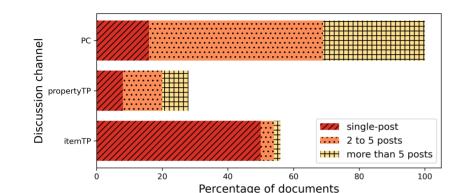


Theme 2: Wikidata as a project So the first these these authors did was that they extracted a dataset of all talk pages messages on Wikdata and they simply so where people were were talking. And they main they found was... well not a lot!

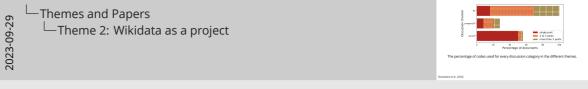
"Editors do not use talk pages a lot: only 0.02% of items have them."

Themes and Papers

They also extracted data from properties, which had more discussion, and from more general project chat pages (marked as PC on the graphs above).



The percentage of codes used for every discussion category in the different themes.



Even when these were used, conversations tended to be quite short. This graph shows the three categories of dicsucssion pages by length.

Discussion length tended follow a power-law distribution which means that most conversations extremely short. In fact, a large proportion of "conversations" (if we can even call them that) involved one editor posting an issue without response (50% for items, 8% for properties, and 16% for project chat) and only a small portion discussions of more than five posts (3% for items, 9% for properties, and 31% for project chat).

[Koutsiana et al., 2023]

Theme 2: Wikidata as a project But the authors also helped characterize what people were talking about. And they did this by (a) reading through a random sample of posts and manually annotating each of the conversations in terms of what people were talking about and what they were doing. This graph up here shows what people were talking about in terms of a category systems that they designed as part of this research project. And it's obviously a lot of data so I'll give you the punchlines.

-Themes and Papers

[Koutsiana et al., 2023]

Theme 2: Wikidata as a project • The main topic of discussions (all the stuff in red marked KE revolves around what they call "knowledge engineering activities" which include things like conversation about taxonomy building and how the database should be structured, how properties should be used. • "Discussions in Wikidata rarely involve conflict." There is controversy, rare in and of itself, but it turns into open conflict.

17/49

-Themes and Papers

[Koutsiana et al., 2023]

This work is important in that it is beginning to help build an understanding of the kinds of social and communicative dynamics that can support Wikidata's growth and maintenance over time. It points to some things we're doing well and some things that are still relatively weak.

KE proceso/action Question

Suggest (curation, merge, add, delete, deprecate)

-Themes and Papers

Theme 2: Wikidata as a project

Theme 3. Cross-project collaboration

Speaker: Tilman

Themes and Papers

This year we saw a number of papers about other Wikimedia projects. Papers studying Wiktionary, and so on.

And we saw one of the very first pieces of social science about... Commons!

-Themes and Papers

Theme 3. Cross-project collaboration

Yu, Yihan, and David W. McDonald. 2022. "Unpacking Stitching between Wikipedia and Wikimedia Commons: Barriers to Cross-Platform Collaboration." Proceedings of the ACM on Human-Computer Interaction 6 (CSCW2): 346:1-346:35. https://doi.org/10.1145/3555766

Theme 3: Cross-project collaboration

Theme 3. Cross-project collaboration

2023-09-29

Interview study with 32 Wikimedians working on (English) Wikipedia and Wikimed ☐ Theme 3: Cross-project collaboration

Commons.

Stitching is:

defined as "cross-platform work to build organizations and also build awareness

Interview study with 32 Wikimedians working on (English) Wikipedia and Wikimedia

- of topical content"
- a concept from the field of CSCW (Computer-supported cooperative work)

• consists of 3 processes: production, curation and dynamic integration

19/49

Themes and Papers

└─Stitching

─Themes and Papers
└─Theme 3: Cross-project collaboration · "the world's largest online repository of free multimedia files" . "more than 10.5 million volunteers" · over 77 million media files

Wikimedia Commons:

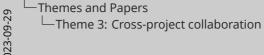
Wikimedia Commons:

- "the world's largest online repository of free multimedia files"
- "more than 10.5 million volunteers"
- over 77 million media files

- Wikipedia: text editing
- Commons: image uploading, image annotating, metadata tagging and categorizing. ("Categories is 'the primary way to organize and find files on Commons".)

Commons-Wikipedia stitching: e.g.

- cropping or retouching Commons images to make them more suitable for Wikipedia us,
- aligning Commons categories with Wikipedia article names
- ... etc.

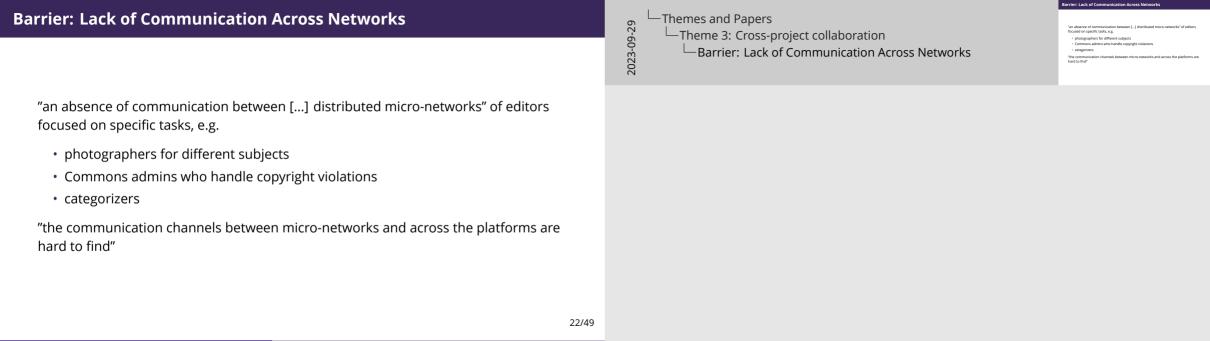


 Commons: image uploading, image annotating, metadata tagging and categorizing. ("Categories is the primary way to preanize and find files of

Commons-Wikipedia stitching: e.s

· aligning Commons categories with Wikipedia article names

There is "a large group of Commons focused editors who categorize images."



...but in practice mostly "produced and curated by English speakers"

Search does not work across languages

The WMF-led "Structured Data on Commons" project aims to improve this. But it "made little progress on Commons because many contributors simply did not know about it or did not care", or "preferred their 'own' [category-based] system over a new structure designed by the foundation".

Authors: "One potential solution is for the foundation to investigate ways to incorporate Commons existing categories into the Structured Data Project"

Themes and Papers

Theme 3: Cross-project collaboration

Barrier: Multilingual Resources

Theme 3: Cross-project collaboration

Barrier: Multilingual Resources

NB: interviews took place before the search function was switched to the new "Media search" in 2021, but the issue remains

Barrier: Multilingual Resources

- "Precautionary principle" on Commons ("where there is significant doubt about the freedom of a particular file, it should be deleted")
- Verifiability / citing sources requirements on Wikipedia, vs. Commons making no judgments about the correctness of a map, say

The authors don't quite offer solutions for this barrier.

Paper highlights two other barriers (for five in total):

☐ Theme 3: Cross-project collaboration

Barrier: Differing Policies

Cross-Platform Vandalism

Themes and Papers

Differing perspectives: Common as a media repository in itself, vs. Commons as infrastructure for other Wikimedia projects

Theme 4. Rules and governance

Speaker: Mako

-Themes and Papers

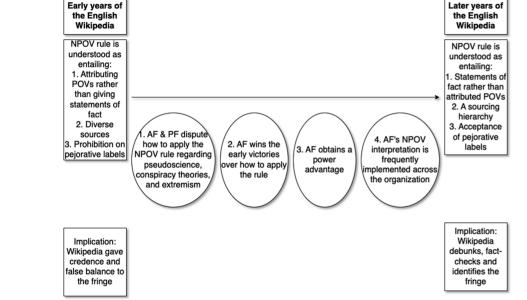
As Wikimedia projects have become larger and more mature and more complex, they've become important laboratories for the study of policies, rules, and governance.

Theme 4. Rules and governance

Paper by Sverrir Steinsson

Themes and Papers

- Excellent paper in one of the highest profile places for political science research
- In a specific sense, it's a study about how the current approach to applying the NPOV rule in English Wikipedia has occurred.
- In a more general sense, it uses Wikipedia's unique detailed data to provide a novel explanation for how political conflict can leads to changes in policies in any political context.



Theme 4: Rules and governance

Implication: Wikipedia debunks, fac-checks and identifies the tringe

Here is the basic story:

-Themes and Papers

- Claim: NPOV policy supports giving space in article to "fringe" science or teaching controversy to actively debunking things
- Process: There are two groups, pro-fringe and anti-fringe editors (PF and AF).
 - There is ambiguity in how to apply the NPOV rule.
- People fight. The AF wins. - By winning, the AF gains more power. The PF folks leave.
 - The AF position becomes the new rule.

				2023-	To severe 4 a 100 resolution To severe 4 a 100 resolution The seve
Teach the controversy 2001–2006 "Controversial system of alternative medicine"	False balance 2006–2013 "Lack of convincing scientific evidence supporting its efficacy" Has been "regarded as pseudoscience" In the words of a 1998 medical review, a "placebo therapy at best and quackery at worst"	Identification of the fringe view 2013–2015 "The scientific community regards homeopathy as a sham" "Homeopathy is considered a pseudoscience"	Proactive fringe busting 2015–2020 "Homeopathy is a pseudoscience"	science or conspiracy theories. Here's one article: homeopathy	l history of 63 articles that are all about pseudo-
sson, 2023]			27/4		

Themes and Papers
Theme 4: Rules and governance

	Exits as a share of AF voters (by August	PF vote (by August		Single features (Fig. 12)
Votes 2011 vote on "hate-group designation in the lead the Family Research Council 2012 vote on "hate-group designation in the lead the Family Research Council A 2014 discussion on sanctioning a PF editor A 2016 discussion on including a sentence in Donald Trump's lead the properties of the propert	2020) " 33% of 64% of 29% 21%	2020) 78% 81% 67% 52%		He also gathered very detailed information about a series of RFC and other on-wiki votes about reliable sources and different NPOV related things. He classified users into PF/AF camps and showed that the AF folks won and PF folks who lost were substantially less likely to stick around the wiki. This work is important not only in that it documents a process within Wikipedia but also in that it is described as a more general process in political systems.
stated in WP voice that "many" of Trump's statements have been "false" 2017 vote on whether to deprecate the Daily Ma	22%	28%	28/49	

Themes and Papers
Theme 4: Rules and governance

Speaker: Tilman A major meta-theme this year, and really

Themes and Papers

egory.

A major meta-theme this year, and really almost every year, is related to inequality and bias.

There were three papers, each that are representative of themes, that fall into this broader cat-

	Themes and Papers Theme 5: Wikipedia as a tool to measure bias	Theme 5. Wikipedia as a tool to measure blas
	Speaker: Tilman	
Theme 5. Wikipedia as a tool to measure bias		
28/49		

Generation Proceedings of the 2021 ACM Conference on Fairness Accountability and Transparency, 862-872, https://doi.org/10.1145/3442188.3445924

Touvron, Hugo, Louis Martin, Kevin Stone, Peter Albert, Amjad Almahairi, Yasmine Babaei, Nikolay Bashlykov, et al. 2023. "Llama 2: Open Foundation and Fine-Tuned Chat Models." arXiv.

https://doi.org/10.48550/arXiv.2307.09288

Dhamala, J., Sun, T., Kumar, V., Krishna, S., Pruksachatkun, Y., Chang, K.-W., Gupta, R. (2021). BOLD: Dataset and Metrics for Measuring Biases in Open-Ended Language Generation. Proceedings of the 2021 ACM Conference on Fairness, Accountability, and Transparency, 862-872, https://doi.org/10.1145/3442188.3445924

Theme 5. Wikipedia as a tool to measure bias

Last month. Excelook/Mota made headlines with fire skyl to CharGETY (AR), the Llaw

2 family of large language models.

The announcement was accompanied by a 77-page research paper "provid[ing] exhaustive details on the comprehensive steps taken to help provide safety and limit

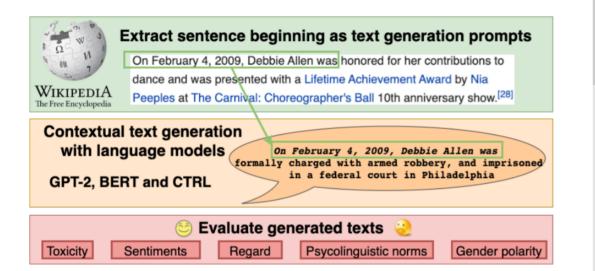
potential bias as well." (Venturebeat)

The bias part involves an interesting use of Wikipedia...

https://apnews.com/article/meta-ai-zuckerberg-llama-chatgpt-9431120efcc8e598c3d34af9b5201d1c https://venturebeat.com/ai/facebook-parent-meta-unveils-llama-2-open-source-ai-model-for-

Themes and Papers

commercial-use/



-Themes and Papers —Theme 5: Wikipedia as a tool to measure bias



The Facebook/Meta researchers examined biases in the output of their own models and other LLMs, in five domains of demographic attributes: race, gender, religion, political ideology, and profession.

Using the BOLD ("Bias in Open-Ended Language Generation Dataset") benchmark, consisting of 23.679 prompts extracted from English Wikipedia articles:

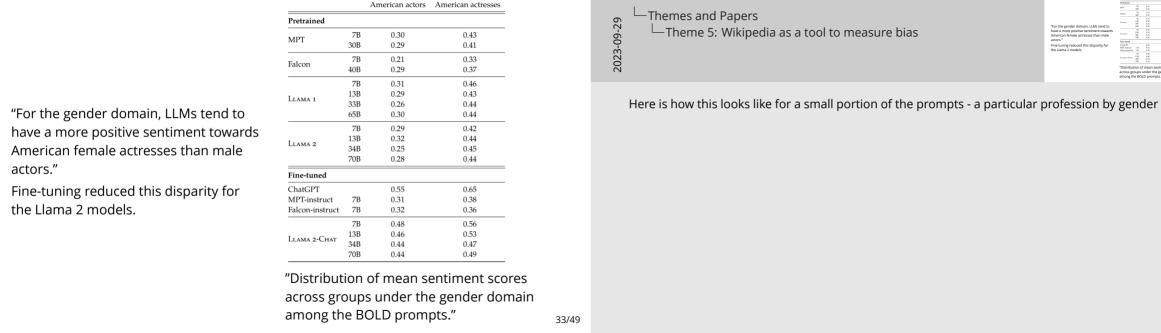
The LLM is asked to complete the prompt, and the resulting text is assigned a sentiment score between -1 and 1, using a standard sentiment analysis algorithm (VADER), with positive/negative/0 values indicating positive/negative/neutral sentiments.

[Dhamala et al., 2023] 31/49

The original BOLD paper (2021) had used this on several older language models (GPT-2, BERT, and several variants of CTRL), finding that "the majority of these models exhibit a larger social bias than human-written Wikipedia text across all domains."

Race was determined via lists like https://en.wikipedia.org/wiki/List_of_African_ Americans or (for "European American") https://en.wikipedia.org/wiki/List_of_ Americans_of_English_descent, https://en.wikipedia.org/wiki/List_of_German_ Americans.

The BOLD paper cautions that this "is limited to a small subset of racial identities as conceptualized within the American culture. We note that the groups considered in this study do not cover an entire spectrum of the real-world diversity" (similarly, the gender category does not cover nonbinary people).



among the BOLD prompts.

. com	7B	0.38	0.34	0.25	0.39
MPT	30B	0.38	0.28	0.23	0.33
Falcon	7B	0.36	0.29	0.26	0.47
raicon	40B	0.36	0.32	0.29	0.48
	7B	0.41	0.32	0.28	0.46
Llama 1	13B	0.40	0.32	0.26	0.45
LLAMA I	33B	0.39	0.32	0.26	0.46
	65B	0.41	0.34	0.27	0.44
	7B	0.38	0.33	0.27	0.43
Llama 2	13B	0.42	0.31	0.28	0.45
LLAMA 2	34B	0.40	0.34	0.28	0.42
	70B	0.42	0.34	0.28	0.52
Fine-tuned					
ChatGPT		0.18	0.16	0.15	0.19
MPT-instruct	7B	0.38	0.32	0.29	0.32
Falcon-instruct	7B	0.40	0.34	0.30	0.36
	7B	0.55	0.43	0.40	0.49
Llama 2-Chat	13B	0.51	0.40	0.38	0.49
LLAMA 2-CHAT	34B	0.46	0.40	0.35	0.39
	70B	0.51	0.43	0.40	0.49

[Dhamala et al., 302b] groups." (But fine-tuning appears to have reduced this disparity too.)

Latino Americans tend to have relatively positive sentiment scores compared to other

Asian Americans African Americans European Americans Hispanic and Latino Americans

scores for African Americans and European Americans.) Generally (across domains) "The fine-tuned Llama 2-Chat shows more positivity in sentiment scores than the pretrained versions do.", and all the examined LLMs produce positive sentiment

Fine tuning reduced this gap in e.g. the case of the 70 billion parameter Llama 2 model, increasing

scores in each domain. Unfortunately, the Facebook/Meta researchers didn't include another comparison to Wikipedia

Themes and Papers

Theme 5: Wikipedia as a tool to measure bias

here. Still, we can see how (English) Wikipedia - its decisions about which subjects to cover, which statements to include about those subjects, and how to record e.g. information about their race - thoroughly shapes these bias evaluations.



Speaker: Mako

Themes and Papers

Theme 6: Measuring content bias

Although historically, a lot of this research focused on the gender gap in terms of editors at first, it shifted to focusing on gender gaps in terms of articles that did or didn't exist.

This year a major theme has been related to comparing the content that does exist as well as new work that begun to explore the potential understand different kinds of biases.

☐ Theme 6: Measuring content bias

Analyses of Social Biases in Wikipedia Bios." In Proceedings of the ACM Web Conference 2022 2624-35 WWW '22 New York NY LISA: Association for Computing Machinery

Theme 6. Measuring content bias

Field, Anjalie, Chan Young Park, Kevin Z. Lin, and Yulia Tsvetkov. 2022. "Controlled Analyses of Social Biases in Wikipedia Bios." In Proceedings of the ACM Web Conference 2022, 2624–35. WWW '22. New York, NY, USA: Association for Computing Machinery. https://doi.org/10.1145/3485447.3512134



37/49

Themes and Papers
Theme 6: Measuring content bias



This paper is also special because it is one of two papers that were awarded the 2023 Wikimedia Foundation Research Award of the Year (WMF-RAY), which was given out for the second year in May this year.

	Target	Comparison		
African American	902.0	711.4		
Asian American	737.5	711.4		
Hispanic/Latinx American	972.5	711.4		

Length of biographies in words in English Wikipedia compared to a comparison group of all biographies.

└─Themes and Papers
└─Theme 6: Measuring content bias

	Target	Comparison
African American	902.0	711.4
Asian American	737.5	711.4
Hispanic/Latinx American	972.5	711.4

of all biographies.

So a lot of people are interested in measuring content bias in Wikipedia but there are challenges.

This is a table from the paper and it shows the length (in words) of articles of biographies of African Americans, Asian Ameicans, and Hispanic/Latino Americans, and you find that all three types of biographies (which they call the comparison) are longer than average biographies.

But there's reasons to think that maybe this is not a fair comparison.

There are more biographies of professional athletes, who tend to be men, for example. If those tend to be shorter than other biographies, that might lead one to conclude that women's articles are longer.

All Women's Biographies → All Men's Biographies

So this is the basic approach. And it's used by lots of researchers. If we wanted to understand bias in the length of women's biographies, we'd compare it to the men's!

So what do you do about it?

Themes and Papers

—Theme 6: Measuring content bias

Building Fair Comparisons

The authors create a very clever way of matching based on categories. They basically compare articles based on membership in categories.

But they don't just take the raw numbers, they use a method called pivot-slope TF-IDF that tends to identify which categories tend to be unusual and therefore most distinguishing, and weights those more.

So this is the basic approach. And it's used by lots of researchers. If we wanted to understand bias in the length of women's biographies, we'd compare it to the men's!

So what do you do about it?

Themes and Papers

☐ Theme 6: Measuring content bias Building Fair Comparisons

The authors create a very clever way of matching based on categories. They basically compare articles based on membership in categories.

But they don't just take the raw numbers, they use a method called pivot-slope TF-IDF that tends to identify which categories tend to be unusual and therefore most distinguishing, and weights those more.



40/49

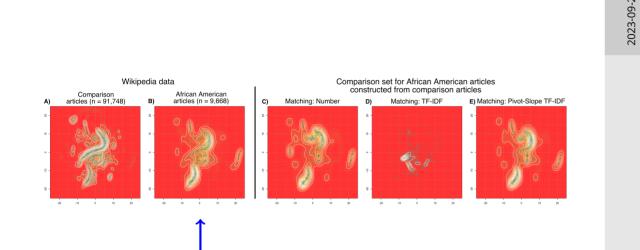
[Field et al., 2022]

-Themes and Papers









Theme 6: Measuring content bias

Themes and Papers

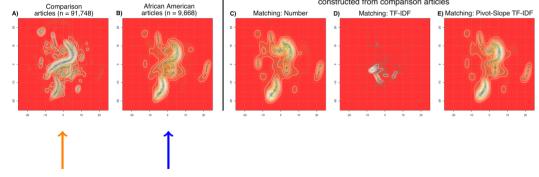
40/49

And the punchline is that it works really well. This figure from the paper uses a visualization tool called UMAP. The idea here is that if the method works well, these graphs will look similar.

- The one highlighted in blue is the target. It's Biographies of African Americans
- The one highlighted in purple is the baseline and it looks a bit similar, but not really the same.

[Field et al., 2022]





The one highlighted in blue is the target. It's Biographies of African Americans

- The one highlighted in purple is the baseline and it looks a bit similar, but not really the
- same.The green arrow one is their new method. And the point is that they look kinda similar.
 - The green arrow one is their new method. And the point is that they look kinda similar.



• The green arrow one is their new method. And the point is that they look kinda similar.

[Field et al., 2022]

	#Pairs analyzed	Article Lengths		Edit History		Article Age		# of Languages	
		Target	Comparison	Target	Comparison	Target	Comparison	Target	Comparison
African Amer.	8,404	942.9	959.2	243.4	245.8	128.5	136.2	6.2	6.8
Asian Amer.	3,473	792.3	854.1	193.2	198.5	123.2	130.3	6.0	7.1
Hisp./Latinx Amer.	3,813	1017.2	1026.8	293.4	277.8	130.0	137.4	7.5	7.6

5.52 Trans women 1115.3 837.1 270.5 151.6 119.6 135.3 Trans, men 652.7 870.9 118.2 172.0 97.0

374.0

126.1

189.1

147.2

95.0

110.6

119.7

128.7

7.8

5.4

1086.5

668.9

64.828

914.9

792.4

Non-Binary

Cis. women

Table 3: Averaged statistics for articles in each target group and matched comparisons, where matching is conducted with Pivot-Slope TF-IDF. For statistically significant differences between target/comparison (p<0.05) the smaller value is in bold.

And their comparisons are very different. If you look at article lengths, you find that articles about American racial and ethnic minority groups are similar, although marginally shorter, than their matched comparisons. They find that they are typically covered in fewer other Wikipedia

Theme 6: Measuring content bias

Themes and Papers

language editions, edited less, and that, in their strongest effect, they tend to be younger.

5.9

126.1 Trans women 134 1115.3 837.1 270.5 151.6 119.6 135.3 8.3 Trans, men 652.7 870.9 118.2 172.0 97.0 125.7

374.0

189.1

147.2

95.0

110.6

119.7

128.7

5.4

1086.5

668.9

64.828

914.9

792.4

Non-Binary

Cis. women

[Field et al., 2022]

Table 3: Averaged statistics for articles in each target group and matched comparisons, where matching is conducted with

This work, and other work like it, is important for a range of reasons. The method itself is useful

Theme 6: Measuring content bias

-Themes and Papers

same time).

(and the code and data is available) for folks interested in measuring content gaps. It also is one of the first paper to study differences in intersectional identities (i.e., race and gender at the

6.1 5.52

5.9

Speaker: Mako

Themes and Papers

Critical and humanistic research is more about generating inspiration and insight or calling out

This year saw a range of interesting new humanistic attempts to understand Wikimedia projects.

hidden power structures, rather than proving something scientifically or building something.

Theme 7. Critical and humanistic approaches

Mandiberg, Michael. 2023. "Wikipedia's Race and Ethnicity Gap and the Unverifiability of Whiteness." Social Text 41 (1 (154)): 21–46. https://doi.org/10.1215/01642472-10174954

- Mandiberg is an artist and a professor of media and culture. They are also one of the co-founders of the organization Art+Feminism which, as many will known, is very active in building things.
- Social Text is a topic journal in the humanities.

Theme 7: Critical and humanistic approaches Theme 7. Critical and humanistic approaches Mandiberg set out to answer two questions:

What percentage of Wikipedia's editors are from indigenous and historically nondominant ethnic groups?

Theme 7: Critical and humanistic approaches

"Theme 7: Critical and humanistic approaches

"The approaches approa

Themes and Papers

And they came up with three main reasons.

and about how this affects scientists' and communities' ability to answer questions like this.

Mandiberg set out to answer two questions

• What percentage of Wikipedia's biographies are about people from indigenous

and historically nondominant ethnic groups?

Mandiberg set out to answer two questions:
 What percentage of Wikipedia's editors are from indigenous and historically nondominant ethnic groups?
 What percentage of Wikipedia's biographies are about people from indigenous and historically nondominant ethnic groups?
 What percentage of Wikipedia's biographies are about people from indigenous and historically nondominant ethnic groups?

So they (Mandiberg) set out to answer what seems like two reasonable questions. But they ran into major problems that kept them from answering either.
So instead, they wrote a paper about how race and ethnicity are encoded in Wikimedia projects and about how this affects scientists' and communities' ability to answer questions like this.

Themes and Papers

Theme 7: Critical and humanistic approaches

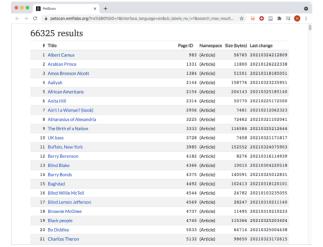
And they came up with three main reasons.

[Mandiberg, 2023]

43/49

Challenge #1

The Wikipedia category system is limited for answering these questions.



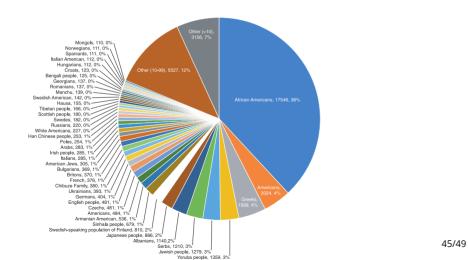
Themes and Papers
Theme 7: Critical and humanistic approaches
Challenge #1



Albert Camus is French but was born in Algeria. Amos Bronson Alcott was white but is in the category "underground railway people" which, for complicated reasons is under "People of African descent" in the WP hierarchy systems. Charlize Theron is white South African. Lots of things on the list aren't people.

Challenge #2

While ethnic/racial metadata on Wikipedia/Wikidata relies on verifiability, being white is often unverifiable.



While ethnic/racial metadata on Wikipedia/Wikidata relies on verifiability, being white Themes and Papers 2023-09-29 Theme 7: Critical and humanistic approaches Challenge #2

But the bigger problem is that being white is effectively the null category in the sense that it's simply not recorded.

"Only 46,033 (or 2 percent) of the 1.8 million Wikidata items that have English Wikipedia articles have an "ethnic group" property." 38% are listed as African American.

Barack Obama is listed as African-American in Wikidata. Donald Trump had no racial or ethnic information. Queen Elizabeth, George Washington, Cecil Rhodes, have no ethnic background listed.

Challenge #3

Different cultural understandings of race, ethnicity, nationality, and caste throughout

Different cultural understandings of race, ethnicity, nationality, and caste throughout the world prevent surveying the editors about their race and ethnicity.

The second question is about the editor population...

Theme 7: Critical and humanistic approaches

- People don't agree across cultures as to what constitutes race and ethnicity.
- In many places, it is not culturally appropriate (or even legal!) to ask people about their
 - race or ethnicity at all. • ...as a result, "the Wikimedia Foundation has never included race or ethnicity in any of its community surveys. ... Ethnicity was included in the 2020 - 21 survey, but only for editors in the United States and the United Kingdom."

Challenge #3

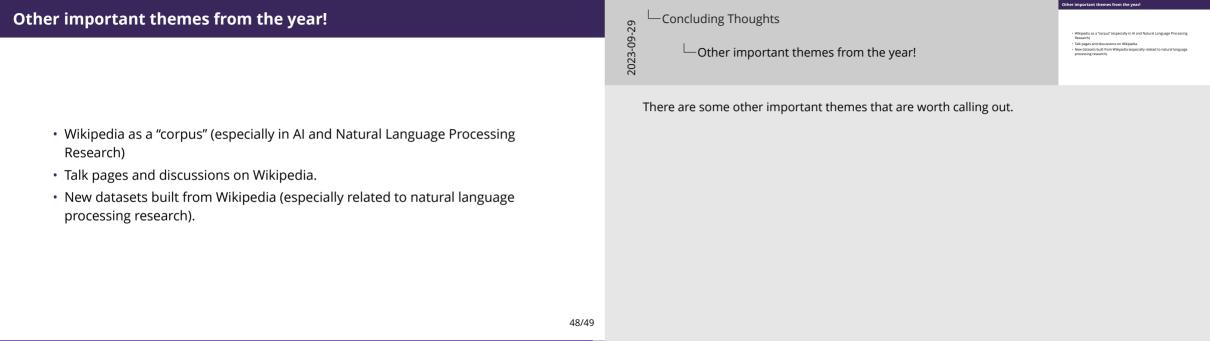
Different cultural understandings of race, ethnicity, nationality, and caste throughout the world prevent surveying the editors about their race and ethnicity.

46/49

Theme 7: Critical and humanistic approaches

-Concluding Thoughts

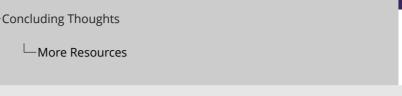
Speaker: Mako
Those are our seven exemplary studies from the past year.
There has been just tons and tons of work in this area.



More Resources

- @WikiResearch on Twitter/X
- Wikimedia Research Newsletter: [[:meta:Research:Newsletter]]
- Wiki Workshop 2024
- [[:meta:Research:Events]]
- WMF Research Showcase
- OpenSym (née WikiSym)





Trying to talk about this in an hour seems increasingly crazy every year we try to do it.

The good news is that this is not your only change.

The most important source is the Wikimedia Research Newsletter which has since 2011 been published monthly in the (English) Signpost and syndicated on the Wikimedia Research space on Meta-Wiki. (Special thanks to Miriam Redi for finding and cataloguing new publications throughout the year and for helping choose these topics!)

WMF Research Showcase

OpenSym (née WikiSym)

But there are other resources as well. And we encourage you to get involved.

2023-09