

GROUNDING ON SHAKY GROUND:

Wikipedia's Legal Articles, Editorial Integrity, and the Risk of Data Poisoning in Artificial Intelligence

Prof. Dr. Matthias Harter July 2025



A (VERY) SHORT RÉSUMÉ

Contact information at the end of this presentation...

SHORT RÉSUMÉ

Some call it CV...



NameProf. Dr. Matthias HarterFields of interest / profession

- Patents and IP
- AI, AGI and humanity
- ASICs, Circuits and Systems
- Aviation, Simulators
- since 07/11 Professor for Embedded Systems and Microcomputers Hochschule RheinMain University of Applied Sciences
- 10/12 09/18 Head of the Department of Electrical Engineering and Information Technology
- 10/17 10/23 Head (founder) of new study program "Electrical and Aviation Engineering"







STARTING POINT: RAG TO FIGHT HALLUCINATION IN LLMS

Retrieval Augmented Generation (RAG) as Countermeasure to Hallucination

HALLUCINATON VS. CONFABULATION Humans also hallucinate / confabulate



Hallucination / Confabulation in LLMs: Filling gaps in memory / knowledge / training



LEGAL DOMAIN IN GERMAN WIKIPEDIA RAG as countermeasure against hallucination



• Prompt for Text-to-Image Generative AI:

"Schematic drawing of an AI system which uses Retrieval Augmented Generation (RAG) as countermeasure against hallucination of the model to improve factual consistency."

> ChatGPT o4 ChatGPT o3 QUESTION **Evaluation** RETRIEVAL AUGMENTED Mitigating Retriever Generator Hallucination **GENERATION (RAG)** Querv RAG (LLM) mitigates hallucination, RETRIEVER MODEL improves factual consistency Improving **VECTOR STORE /** Factual **KNOWLEDGE BASE** Consistency Response ANSWER

29.05.2025

LEGAL DOMAIN IN GERMAN WIKIPEDIA Idea of a RAG based AI chatbot for non-experts



• Prompt for Text-to-Image Generative AI:

"Schematic representation of an AI-based chatbot in the form of an app that answers legal questions for laypersons and bases its answers solely on articles from Wikipedia according to the RAG approach."

Al-based Chatbot



ChatGPT o3





Research Question:

"Does relying on articles from Wikipedia in a RAG-based AI system improve the factual accuracy of answers and mitigate hallucation or do these articles have an inherent problem concerning infiltration by malicious authors and even politically motivated manipulations?"





METHODOLOGY

The process to download all legal domain articles from the German Wikipedia

Downloading process using Wikipedia's API



Maintenance-Category Retrieval

Step 1

Maintenance categories used by Wikipedia to tag outdated or problematic pages are downloaded. These serve as one filtering criterion to exclude articles from subsequent steps if they are deemed insufficiently maintained or not in compliance with editorial standards.

Download of Legal Subcategories

Starting from the toplevel category "Recht" ("law") in the German Wikipedia, all subcategories are recursively traversed, collecting any articles placed under these nested categories.

Template-Based Retrieval

Identification of all articles that utilize one of all existing lawspecific templates (e.g., infoboxes or structured references) designed to provide a uniform layout for legal topics.

Keyword-based Title Search

Using a list of legal terms from a specialized law dictionary [18], a titlesearch is performed.

Expansion via Internal Links

Downloading process using Wikipedia's API





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Downloading process using Wikipedia's API: Article Count



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with editorial standards.



Downloading process using Wikipedia's API: Filtering Process





Downloading process using Wikipedia's API: Filtering Process





Downloading process using Wikipedia's API: Filtering Process





Downloading process using Wikipedia's API: Manual Review of Categories



15344 articles in database after 5 step procedure







FINDINGS

Analysis of articles edited by permanently blocked users



Reasons for permanently blocking (banning) users



Reason	No. of Users	Percentage
Non-Compliance	183,756	99%
At Own Request	1,455	0.8%
Deceased	344	0.2%
All Permanently Blocked Users	185,555	100%

REASONS FOR AUTHOR BANS IN WIKIPEDIA



BANNED USERS Reasons for "Non-Compliance"



 "Sockpuppetry" denotes a clear strategy for infiltration: manipulated accounts operated under pseudonyms, sometimes identified through investigations documented by both investigative journalism and Wikipedia itself [19] [20] [21]



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Absolute numbers:

















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BANNING RATIO IN REVISIONS Number of revisions with bans in relation to all



 Banning Ratio for Revisions (BR_rev): Number of revisions of a certain article (in the legal domain) originating from a banned user in relation to the total number of revisions of that article

BR_rev =
$$\frac{\text{#rev_banned_users}}{\text{#rev total}}$$
 Varticles

BANNING RATIO IN REVISIONS

Number of revisions with bans in relation to all



Banning Ratio	Articles	Percentage
0% (no infiltration)	4,682	30.51%
between 0% and 10%	9,216	60.00%
between 10% and 20%	978	6.37%
between 20% and 30%	261	1.70%
between 30% and 40%	125	0.81%
between 40% and 50%	52	0.34%
more than 50%	30	0.20%
	15,344	100%



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BANNING RATIO IN REVISIONS Number of revisions with bans in relation to all



• Banning Ratio for Revisions:

Number of revisions of a certain article (in the legal domain) originating from a banned user in relation to the total number of revisions of that article

- Only **30.51%** of articles have revision **from good-faith editors solely**.
- ~1% of articles have their last revision authored by a user later banned.



 Banning Ratio for Discussion (BR_disc): Number of contributions (posts) on the discussion page of a certain article (in the legal domain) originating from a banned user in relation to the total number of contributions for that article

BANNING RATIO IN DISCUSSION

Number of discussions with bans in relation to all





BANNING RATIO IN DISCUSSION

Number of discussions with bans in relation to all





BANNING RATIO IN DISCUSSION Posts in discussion with bans in relation to all



• Banning Ratio for Discussion:

Number of contributions (posts) on the discussion page of a certain article (in the legal domain) originating from a banned user in relation to the total number of contributions for that article

- ~30% of articles have no associated dicussion page
- ~50% of articles have no banned contributors on discussions page
- ~21% of articles have banned contributors on discussions page, but only in 0.7% of articles these banned contributors dominated the discussion (majority of posts from banned users)



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- ~21% of articles have banned contributors on discussions page, but only in 0.7% of articles these banned contributors dominated the discussion (majority of posts from banned users)
- Not surprising: Malicious users tend to avoid discussions in favor of infiltrating the article itself in the first place



SUMMARY

Extend of infiltration in German Wikipedia in a selected domain

"Wikipedia: We Have a Problem!"

SUMMARY

- In summary, even a specialized, seemingly neutral topic, such as "Recht" (law) on the German Wikipedia, exhibits clear patterns of infiltration by permanently banned contributors.
- The belief that **crowdsourced content** will **always self-correct** through sheer volume of contributors is challenged by the persistent manipulation attempts observed here.
- Countermeasures, including refined scraping, filtering processes, and real-time oversight, are crucial steps toward ensuring the continued integrity of open knowledge ecosystems.





OUTLOOK Things to do ...



- Broader Multi-Domain Analysis: Replicating this methodology for additional subject areas would clarify whether the observed infiltration patterns are specific to the legal sphere or mirrored across other domains.
- **Refined Filtering for Al Data**: For RAG-based systems or training pipelines, removing or downweighting articles that show high infiltration scores and introducing a reliability metric into prompts can reduce the risk of providing manipulated content to end users.
- Ongoing Community Oversight: As infiltration continues to evolve, a coordinated effort by Wikipedia administrators and community volunteers is essential.



REFERENCES AND CONTACT INFORMATION

Comments and discussion always welcome!

SELECTED REFERENCES

Full list: see paper



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THANK YOU FOR LISTENING



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