



Detecting AI Slop in Research and Beyond

Danish Pruthi

Natural Language Processing

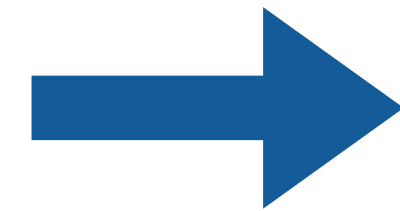
The science and engineering of building computational models to comprehend language

Natural Language Processing

The science and engineering of building computational models to comprehend language

Text Classification

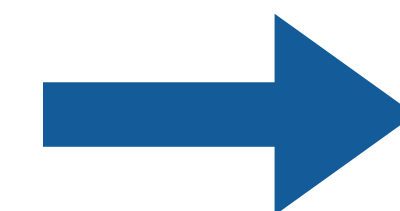
"Lots of epic shows feel a little underpopulated towards the end but there's really no excuse for something as mythic, huge and mesmerizing to end as disappointingly as this."



Negative

Machine Translation

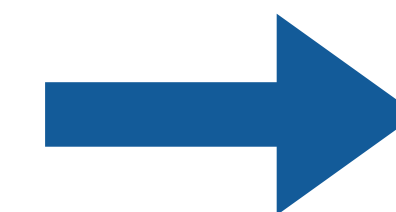
"India recorded their first Test victory, in their 24th match, against England at Madras in 1952. Later in the same year, they won their first Test series, which was against Pakistan."



भारत ने 1952 में मद्रास में इंग्लैंड के खिलाफ अपने 24वें मैच में अपनी पहली टेस्ट जीत दर्ज की। बाद में उसी वर्ष, उन्होंने अपनी पहली टेस्ट श्रृंखला जीती, जो पाकिस्तान के खिलाफ थी।

Question answering

"When did India win their first test match?"

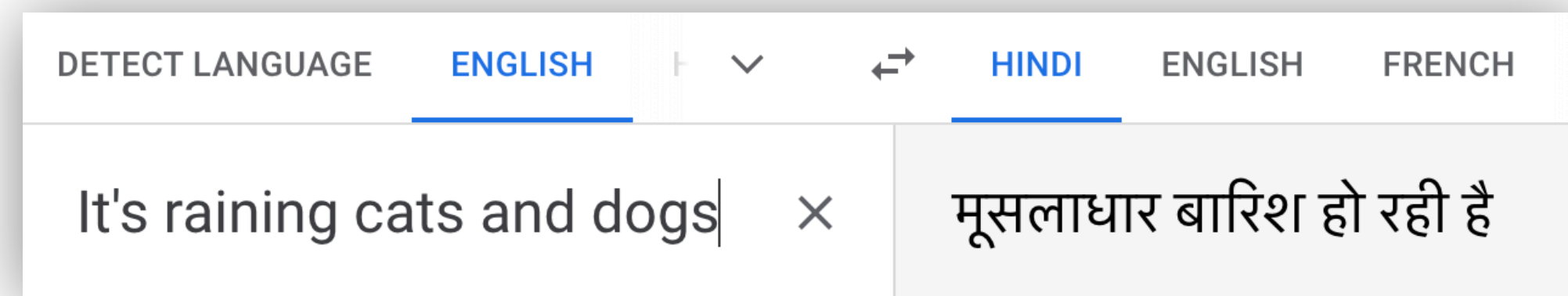


1952

Impact of Language Technologies



Let me get back to you sometime tomorrow



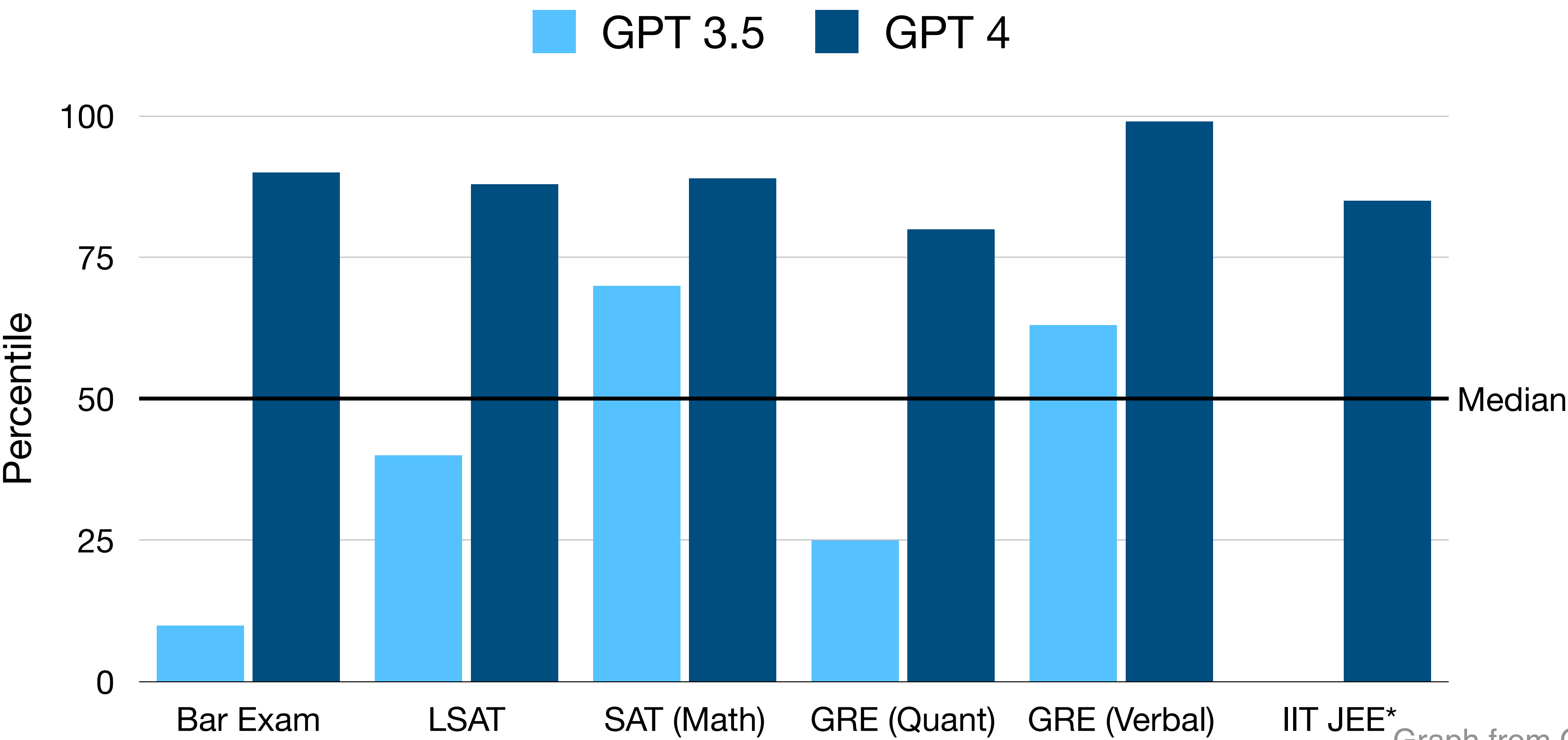
The following media includes potentially sensitive content. [Change settings](#) [View](#)

Language Models

Models that assign probabilities to a sequence of words

- I am sorry for the inconvenience ____
- Let me get back to you sometime ____
- I work at IISc, I live in ____
- The Prime Minister of India is ____

Recent Performance Trends



Graph from OpenAI
* Arora et al. 2024

Promise of LLMs

- In advancing science (e.g., Alphafold)

Promise of LLMs

- In advancing science (e.g., Alphafold)
- In automating scientific research?

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- In advancing science (e.g., AlphaFold)
- In automating scientific research?

The AI Scientist: Towards Fully Automated Open-Ended Scientific Discovery

Chris Lu^{1,2,*}, Cong Lu^{3,4,*}, Robert Tjarko Lange^{1,*}, Jakob Foerster^{2,†}, Jeff Clune^{3,4,5,†} and David Ha^{1,†}

^{*}Equal Contribution, ¹Sakana AI, ²FLAIR, University of Oxford, ³University of British Columbia, ⁴Vector Institute, ⁵Canada CIFAR AI Chair, [†]Equal Advising

Zochi Publishes A* Paper

#1 Scientific Venue in NLP

Published May 27, 2025

Zochi Achieves Main Conference Acceptance at ACL 2025

Today, we're excited to announce a groundbreaking milestone: Zochi, Intology's Artificial Scientist, has become the first AI system to independently **pass peer review at an A* scientific conference**¹—the highest bar for scientific work in the field.

This achievement marks a **watershed moment** in the evolution of innovation. For the first time, an artificial system has independently produced a scientific discovery and published it at the level of the field's top researchers—making Zochi **the first PhD-level agent**. The peer review process for the main conference proceedings of such venues is designed to be highly selective, with stringent standards for novelty, technical depth, and experimental rigor. To put this achievement in perspective, most PhD students in computer science spend **several years** before publishing at a venue of this stature. AI has crossed a threshold of scientific creativity that allows for contributions alongside these researchers at the highest level of inquiry.

Towards an AI co-scientist

Juraj Gottweis*, ‡, ¹, Wei-Hung Weng*, ‡, ², Alexander Daryin*,¹, Tao Tu*,³,
Anil Palepu², Petar Sirkovic¹, Artiom Myaskovsky¹, Felix Weissenberger¹,
Keran Rong³, Ryutaro Tanno³, Khaled Saab³, Dan Popovici², Jacob Blum⁷, Fan Zhang²,
Katherine Chou², Avinatan Hassidim², Burak Gokturk¹,
Amin Vahdat¹, Pushmeet Kohli³, Yossi Matias²,
Andrew Carroll², Kavita Kulkarni², Nenad Tomasev³, Yuan Guan⁷,
Vikram Dhillon⁴, Eeshit Dhaval Vaishnav⁵, Byron Lee⁵,
Tiago R D Costa⁶, José R Penadés⁶, Gary Peltz⁷,
Yunhan Xu³, Annalisa Pawlosky^{1, ‡}, Alan Karthikesalingam^{2, ‡} and Vivek Natarajan^{2, ‡}

¹Google Cloud AI Research, ²Google Research, ³Google DeepMind,

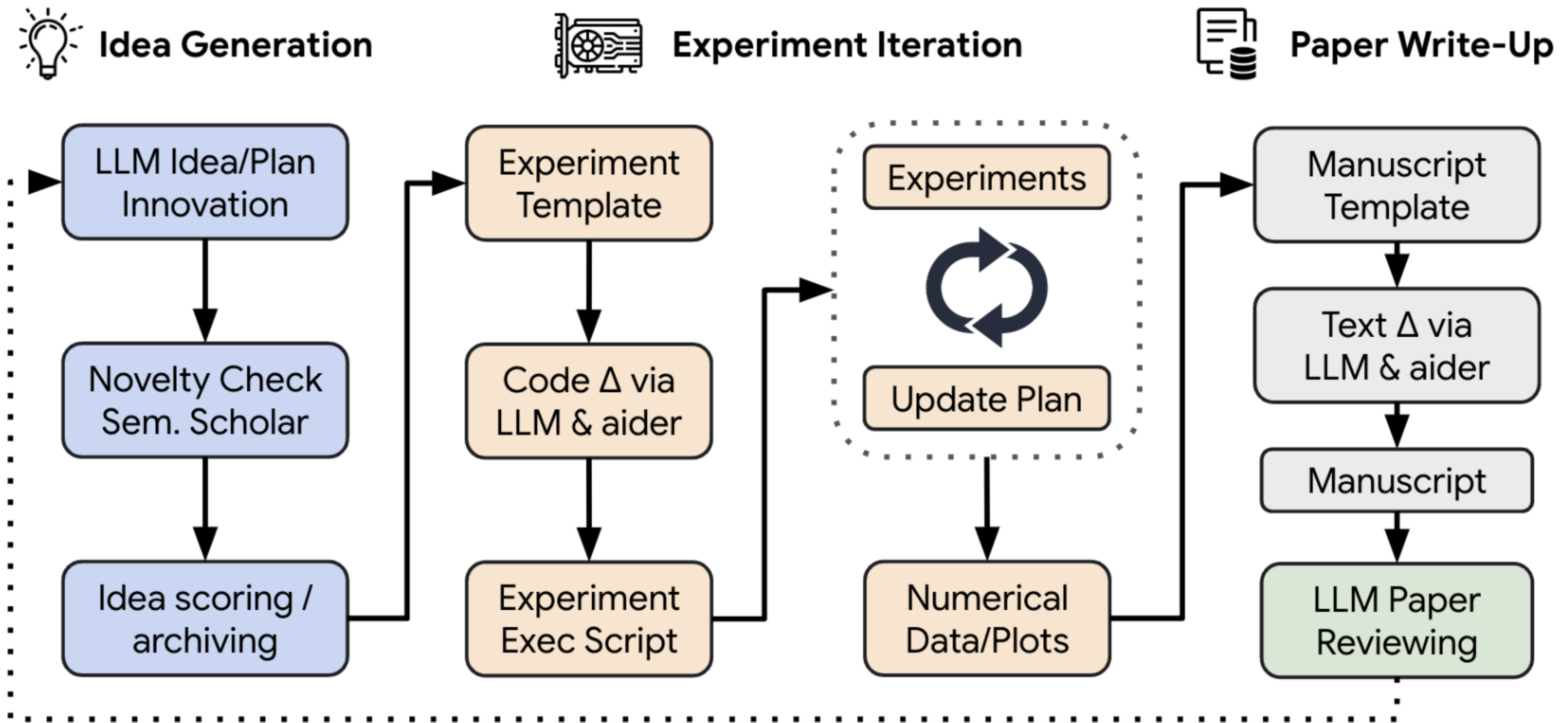
⁴Houston Methodist, ⁵Sequome,

⁶Fleming Initiative and Imperial College London,

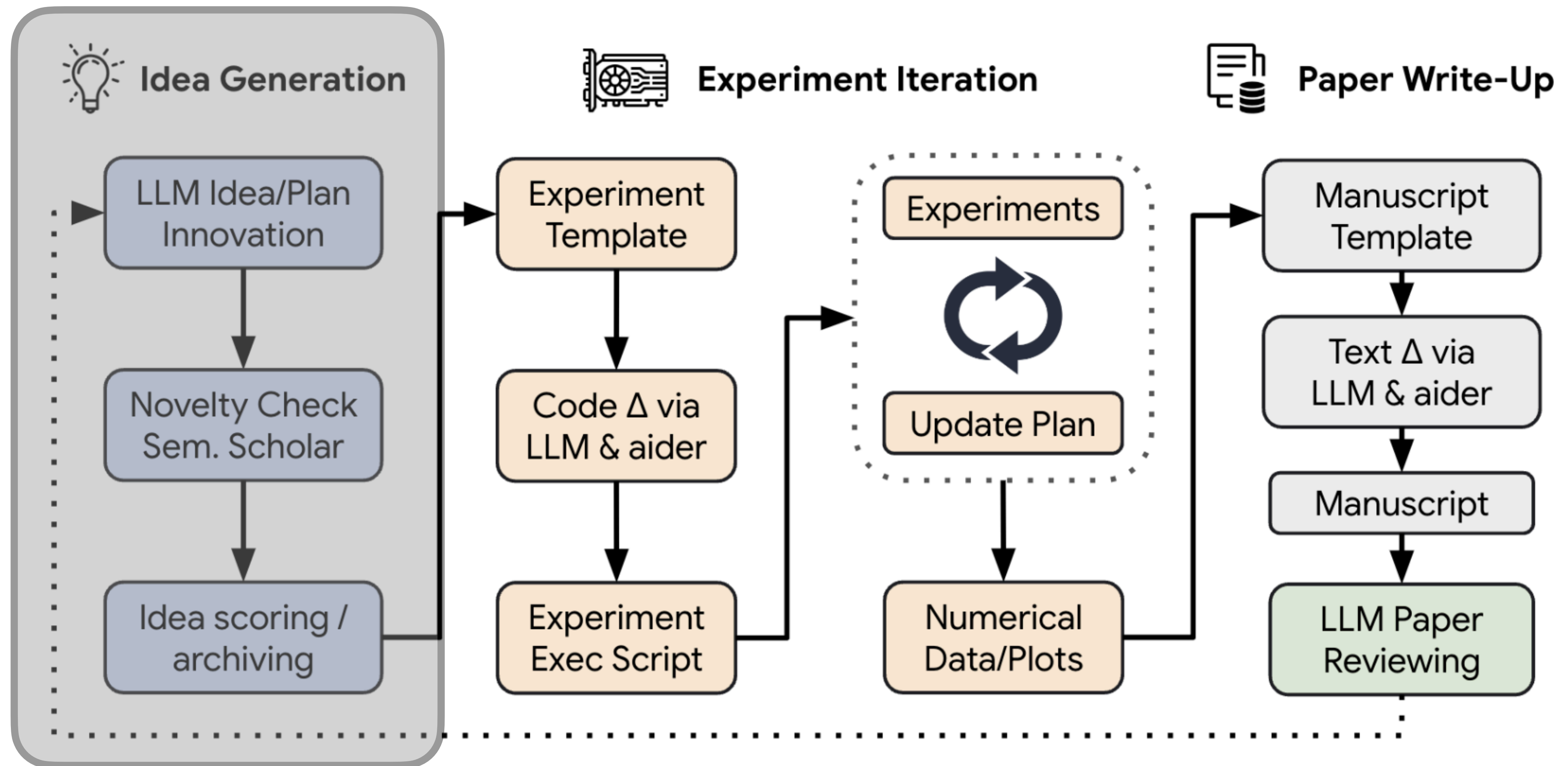
⁷Stanford University School of Medicine

<https://arxiv.org/pdf/2502.18864>

Conceptual Illustration of the "AI Scientist"



Conceptual Illustration of the "AI Scientist"



Can LLMs Generate Novel Research Ideas?

A Large-Scale Human Study with 100+ NLP Researchers

Chenglei Si, Diyi Yang, Tatsunori Hashimoto

Stanford University

{clsi, diyiy, thashim}@stanford.edu

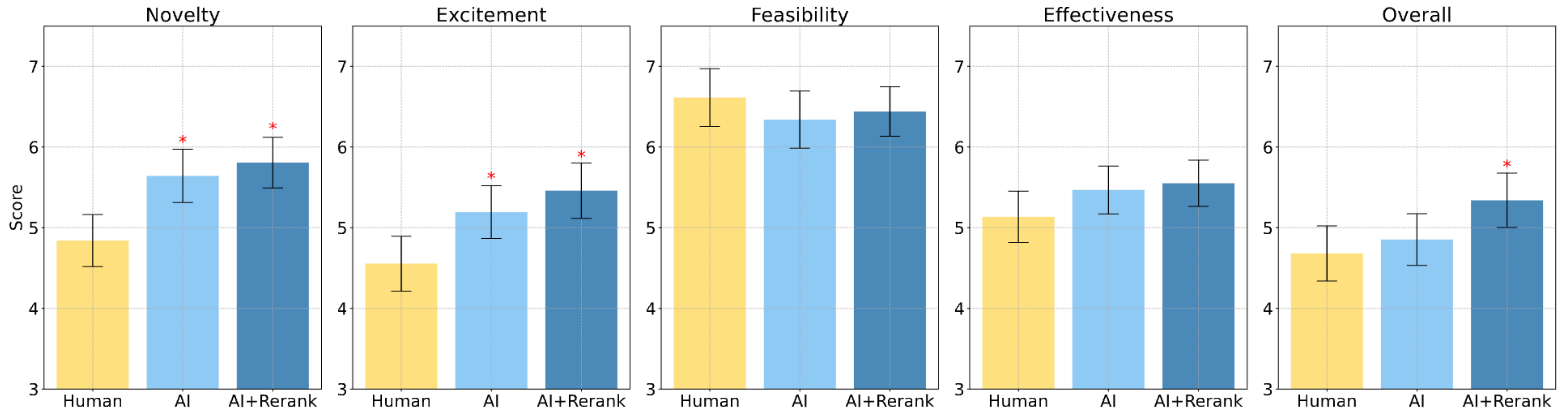
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Evaluation Philosophy

- **Prior work: Experts assess shuffled LLM/human documents for novelty, feasibility, interestingness, etc.**
- **Our work: Experts actively search for plagiarism**
 - Different situational logic (Popper, 2013)
 - Presume plagiarism
 - Actively search for overlap in methodology in existing work

Dataset

- **50 LLM-generated research documents**
 - 36 fresh proposals generated from Si et al. (2024)
 - 4 exemplar proposals from Si et al. (2024)
 - 10 exemplar papers from “The AI Scientist” paper (Lu et al. (2024))
- **12 NLP research topics**
 - Long context capabilities, abstention techniques, bias evaluation
 - Hallucination reduction, interpretability, speech processing
 - Formal proof generation, human evaluation, machine translation
 - Scaling laws, inference optimization, persona development

Expert-led Evaluation

- 13 experts from 5 universities, 2 industrial labs

Score	Description
5	Direct Copy: One-to-one mapping with existing methods
4	Combined Borrowing: Mix-and-match from 2-3 prior works
3	Partial Overlap: Decent similarity, no exact correspondence
2	Minor Similarity: Very slight resemblance, mostly novel
1	Original: Completely novel

Key result

- Large number of proposals ($> 24\%$) are plagiarized

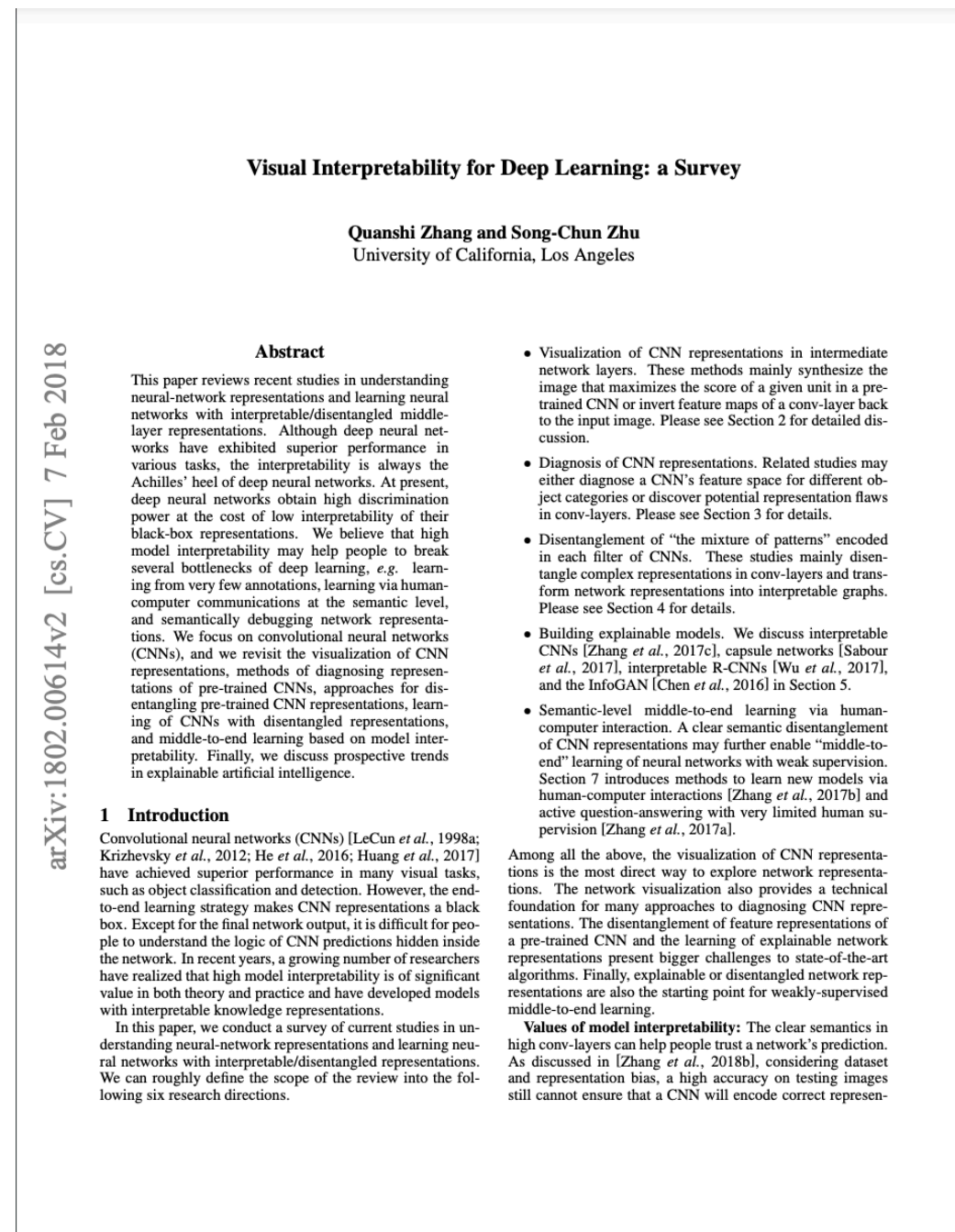
Score	Total Claims (%)	Verified (%)
5	18.0% (9/50)	14.0% (7/50)
4	18.0% (9/50)	10.0% (5/50)
3	32.0% (16/50)	8.0% (4/50)
2	28.0% (14/50)	4.0% (2/50)
1	4.0% (2/50)	0.0% (0/50)

The nature of plagiarism is sophisticated

- Models learn to disguise existing work as novel
- Re-invent terminologies
 - "Resonance graph" instead of "weighted adjacency matrix"
- Several other case studies in the paper

Can plagiarism be automatically detected?

- We create a synthetic dataset of plagiarized ideas



Plagiarized
Research Article

Can plagiarism be automatically detected?

- Can detectors identify deliberately plagiarized articles?

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- Can detectors identify deliberately plagiarized articles?

Method		Accuracy
Claude 3.5 Sonnet	Oracle access	88.8%
	Parameteric Knowledge	1.3%
	SSAG	51.3%
GPT-4o	Oracle access	89.0%
	Parameteric Knowledge	32.7%
	SSAG	68.5%
OpenScholar		0%
Turnitin		0%

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Plagiarism in human-written papers?

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- But experts regularly peer-review papers...
 - So we extract signs of plagiarism in peer-reviews

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Conference	Score 4 (%)	Score 5 (%)	Plagiarism rate (scores 4+) (%)
ACL 2017	0.8%	0%	0.8%
ICLR 2017	4.0%	2.3%	6.3%
CoNLL 2016	5.3%	0%	5.3%
NeurIPS 2017	1.8%	0%	1.8%

Broader Implications of AI Scientists

- Regurgitate old ideas, without any attribution
- Overwhelm conferences
- Fracture scientific discourse
- Sow distrust about other legitimate AI capabilities

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All That Glitters is Not Novel: Plagiarism in AI Generated Research

By Tarun Gupta, Danish Pruthi

ACL 2025



Impact of the work

- Paper received the outstanding paper award at ACL

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NEWS FEATURE | 20 August 2025 | Clarification [03 September 2025](#)

What counts as plagiarism? AI-generated papers pose new risks

Researchers argue over whether ‘novel’ AI-generated works use others’ ideas without credit.

By [Ananya](#)

Broadly: Detecting AI Slop

AI Slop: low-quality, often nonsensical or misleading, content generated by artificial intelligence.

[With 'AI slop' distorting our reality, the world is sleepwalking into disaster](#)

By Nesrine Malik in the Guardian

[AI-generated 'slop' is slowly killing the internet](#)

By Arwa Mahdawi in the Guardian

Increasing Reports of Plagiarism

Business News / Ai / Artificial Intelligence / UK universities launch probe after 400 stud...

UK universities launch probe after 400 students found cheating through ChatGPT

1 min read • 07 Jul 2023, 07:34 PM IST

Edited By Devesh Kumar

My students are using AI to cheat. Here's why it's a teachable moment

Siva Vaidhyanathan

EXCLUSIVE: 'Half of school and college students are already using ChatGPT to cheat': Experts warn AI tech should strike fear in all academics

- Many school districts have already banned the use of ChatGPT
- GPT-4 can score 90 percent on many exams already including the American bar

Increasing Concerns of Targeted Misinformation

Technology

OpenAI chief concerned about AI being used to compromise elections

By Diane Bartz, Zeba Siddiqui and Jeffrey Dastin

May 17, 2023 3:42 AM GMT+5:30 · Updated 5 months ago



AI-generated disinformation poses threat of misleading voters in 2024 election

Politics May 14, 2023 7:52 PM EDT

Need to Distinguish LLM Outputs from Human Text

- Detect plagiarism
- Combat targeted large-scale misinformation/spam/abuse
- Avoid re-training on LLM outputs

Possible Approaches

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- You might get lucky:

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I am impressed by the innovative work being carried out at the LOCA lab and am particularly drawn to [mention a specific project or aspect of the lab's work that interests you]. My enthusiasm for this research area, combined with my [mention any additional qualifications or achievements], motivates me to contribute to and excel in your research team.

I have attached my CV and any other required documents as per the IISc application guidelines. I am available for interviews at your convenience and am excited about the opportunity to discuss how my skills and experiences align with the goals of the LOCA lab.

Possible Approaches

- You might get lucky:

██████████ to Me & danishp@iisc.ac.in

↩ ⏪ ⏩ MAR 21

It looks like you have applied for a position (possibly a research internship or winter school) at IISc and received a response from Danish. Since you've already applied, you might want to send a polite follow-up email to express your enthusiasm and confirm your application status. Here's a refined response you could use:

Respected sir,

I have officially submitted my application through the IISc admissions portal and also filled out the additional form.

Possible Approaches

- Model developers could **store all the responses** generated

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Possible Approaches

- Model developers could **store all the responses** generated
- Wouldn't work for open-source models
- Privacy concerns

Possible Approaches: Watermarking



A Watermark for Large Language Models

John Kirchenbauer* Jonas Geiping* Yuxin Wen Jonathan Katz Ian Miers Tom Goldstein
University of Maryland

ICML 2023 (Best Paper Award)

Watermarking Language Models

Watermarking Language Models

I work at the Indian Institute of
Science. I live in _____

Watermarking Language Models

I work at the Indian Institute of
Science. I live in Bangalore 0.7
the 0.1
Chicago 0.05
Seattle 0.04
California 0.005
India 0.004
London 0.003
Canada 0.001
...
...

Watermarking Language Models

I work at the Indian Institute of

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0.7

the

0.1

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0.05

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0.04

California

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London

0.003

Canada

0.001

...

...

...

...

1. Randomly partition the vocabulary based on the last word

2. Don't generate a word from the red list

How does detection work

- If all words are from green list, then we know it's from a model

Watermarking Language Models

I work at the Indian Institute of
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Bangalore	0.7
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...	...
...	...




1. Randomly partition the vocabulary based on the last word
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Watermarking Language Models

I work at the Indian Institute of
Science. I live in

Bangalore	0.7	
the	0.1	+ delta
Chicago	0.05	+ delta
Seattle	0.04	+ delta
California	0.005	+ delta
India	0.004	
London	0.003	+ delta
Canada	0.001	+ delta
...
...




1. Randomly partition the vocabulary based on the last word

~~2. Don't generate a word from the red list~~ Boost green words

Watermarking Language Models

Soft

I work at the Indian Institute of
Science. I live in Bangalore



the	0.1	+ delta
Chicago	0.05	+ delta
Seattle	0.04	+ delta
California	0.005	+ delta
India	0.004	
London	0.003	+ delta
Canada	0.001	+ delta

...

...

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large fraction
(than what we would expect randomly)

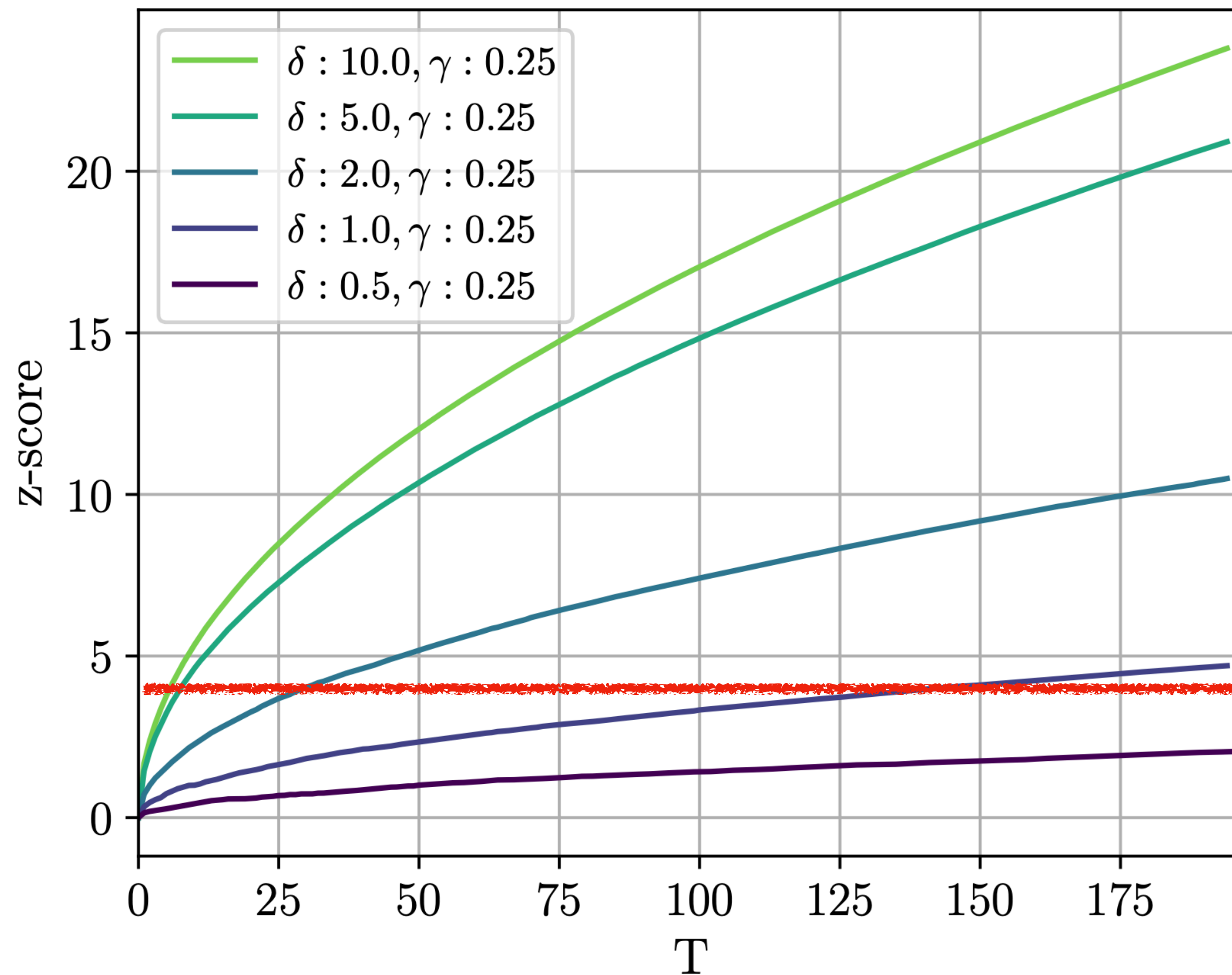
How does detection work

- If ~~all~~ words are from green list, then we ~~know~~ it's from a model
large fraction (than what we would expect randomly) suspect (we can run a statistical test)

Useful Properties

- Can be applied to any language model
- Knobs to play around with the watermarking strength
- Watermarking is conceptually simple & computationally cheap
- Detection does not depend on the model probabilities

Efficacy of watermarking

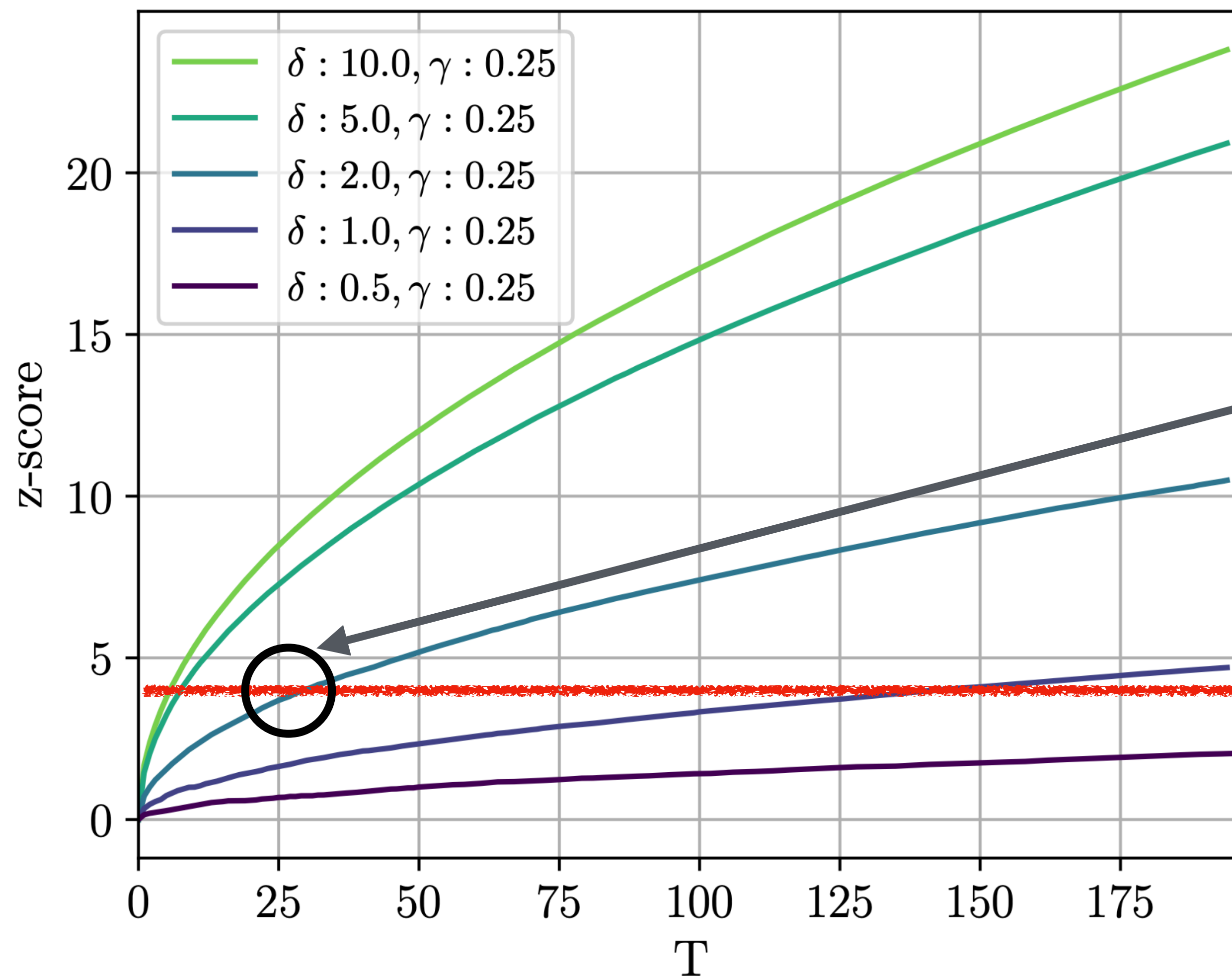


$$z = (|x_G| - \gamma T) / \sqrt{T\gamma(1 - \gamma)}$$

$$z \propto r_G \sqrt{T}$$

False positive rate is 3×10^{-5}

Efficacy of watermarking



$$z = (|x_G| - \gamma T) / \sqrt{T\gamma(1 - \gamma)}$$

$$z \propto r_G \sqrt{T}$$

Often, about 30 tokens suffice

False positive rate is 3×10^{-5}

Our Work

- **Downstream effects of watermarking (Findings of EMNLP, 2024)**
 - By Anirudh Ajith, Sameer Singh, Danish Pruthi
 - <https://arxiv.org/abs/2311.09816>
- **Undoing (or reverse-engineering) watermarking (EMNLP 2024)**
 - By Saksham Rastogi, Danish Pruthi
 - <https://arxiv.org/abs/2411.05277>
- **Watermarking your own content (ICML 2025)**
 - By Saksham Rastogi, Pratyush Maini, Danish Pruthi
 - <https://arxiv.org/abs/2504.13416>

In Practice: *Almost No Adoption*

In Practice: *Almost No Adoption*

- Corporations are (allegedly) worried that they'll lose customers
- Requires all developers to watermark

In Practice

- Hundreds of available detectors:
 - Originality,
 - GPTZero,
 - DetectGPT,
 - Pangram, etc.
- Which work with varying effectiveness

Thank you



Danish Pruthi

Webpage: <https://danishpruthi.com/>

Papers: <http://bit.ly/danish037>

Email: danishp@iisc.ac.in