

DEMASQ: Unmasking the ChatGPT Wordsmith

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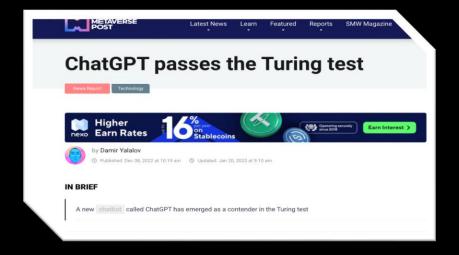
NDSS 2024



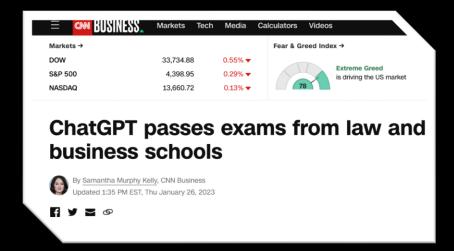




The LL-Mania



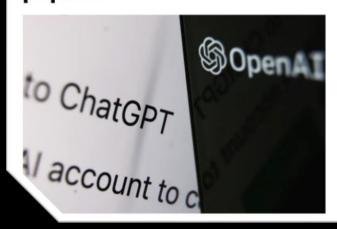






ChatGPT-Phobia

Top AI conference bans use of ChatGPT and AI language tools to write academic papers



Al tools can be used to 'edit' and 'polish' authors' work, say the conference organizers, but text 'produced entirely' by Al is not allowed. This raises the question: where do you draw the line between editing and writing?

By James Vincent, a senior reporter who has covered AI, robotics, and more for eight years at The Verge.









NLP Chatbots Language models ML

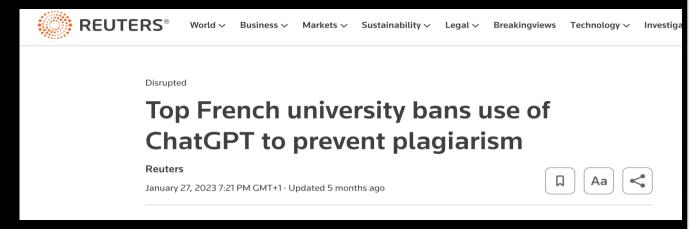
ChatGPT and AI Text Generator Tools Banned by ML Event

ICML authors cannot use text-generation tools unless 'presented as a part of the paper's experimental analysis.'





From ChatGPT to CheatGPT



Japanese universities become latest to restrict use of ChatGPT

Al experts warns there could be disruptions in academia due to the breakthrough technology

Vishwam Sankaran • Monday 10 April 2023 09:08 • Comments

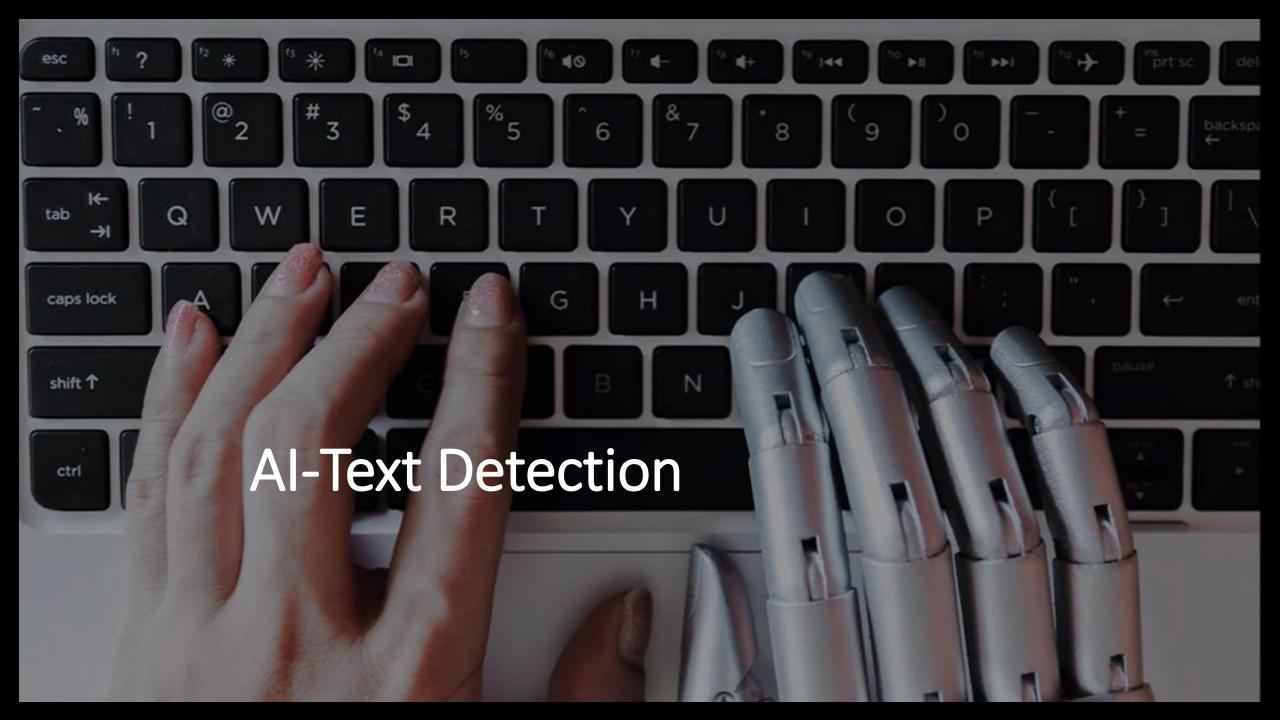
ld Scotland Health Education Technology Science Environment Business

Oxford and Cambridge ban ChatGPT over plagiarism fears but other universities choose to embrace AI bot

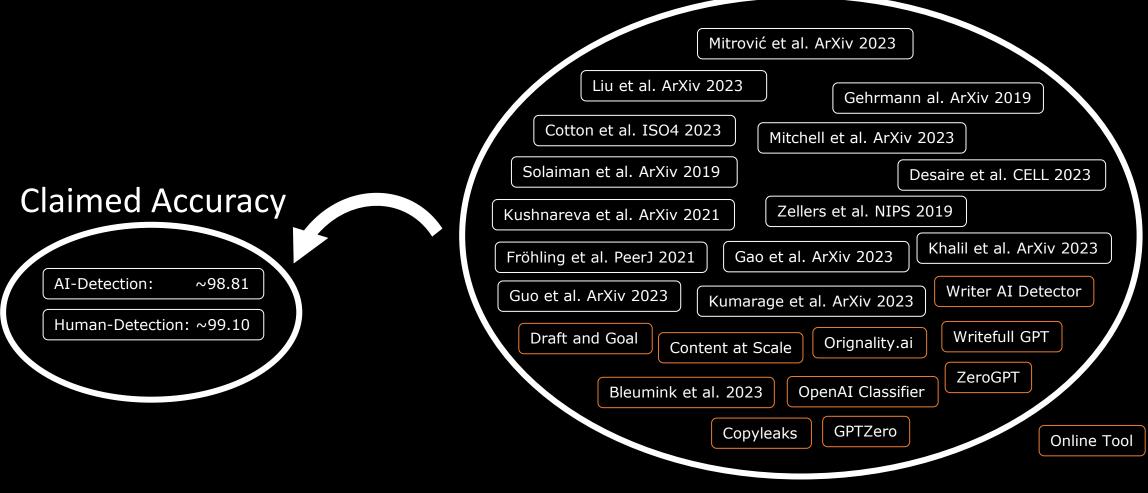
EXCLUSIVE

A third of Russell Group universities told i they have banned the AI chatbot for assessed essays, but other institutions have decided to explore its use for writing bibliographies and references



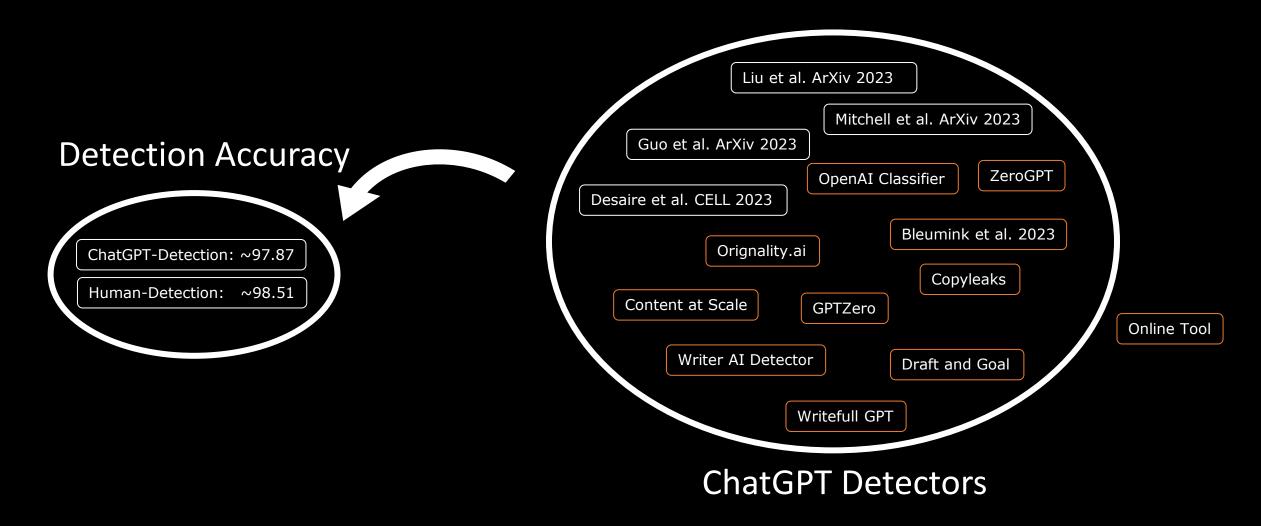


Al-Text Detectors: State-of-the-Art

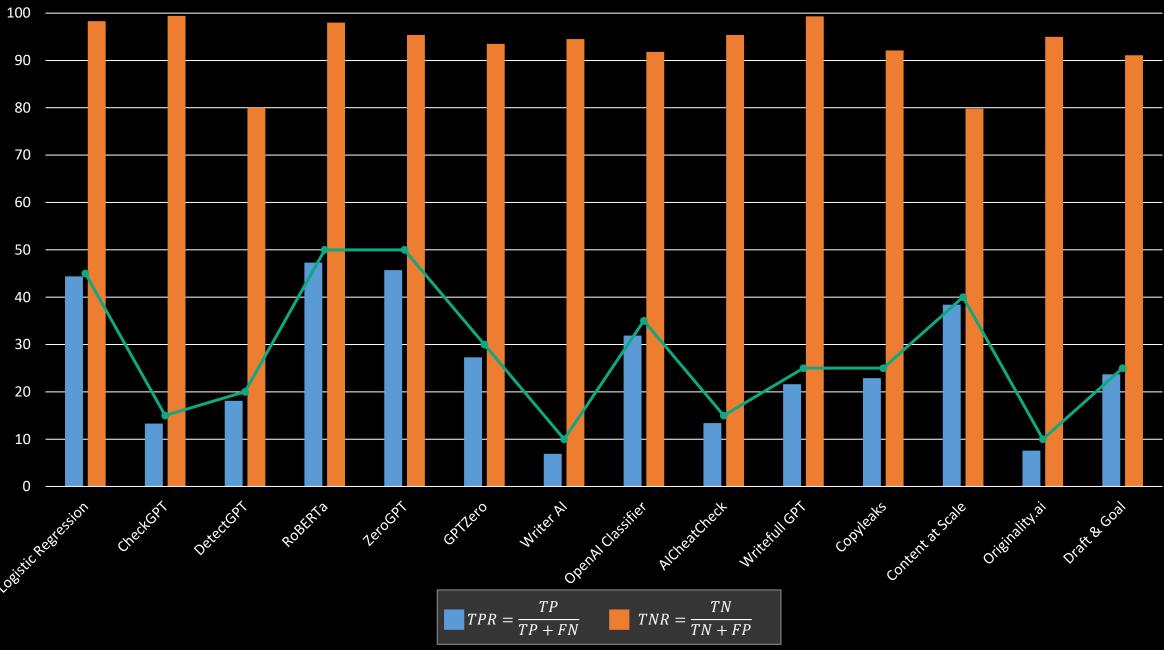


Al-Text Detector

Existing ChatGPT Detectors



Evaluation of ChatGPT Detectors





Human vs.
Machine
Behavior



Human Behavior Bias

- Conscious
- Decision Making
- Creativity and Imagination
- Contextual Understanding
- Adaptability and Learning
- Cognitive differences
- Empathy and Emotional Intelligence
- Common Sense Reasoning
- Intuition and Instinct
- Humor and Sarcasm
- Psychology

Actions, Feelings, and Emotions



Aggravate

Aggressively

Agitated

AFK (Away

from Keyboard)

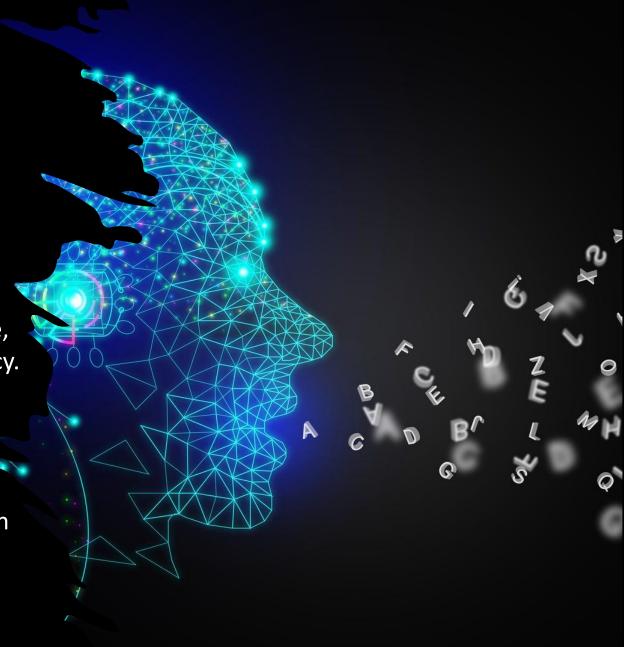
Afraid

Intuition and Hypothesis

 Human interactions exhibit diverse patterns and inherent biases. Thus, when thoughts (or when translated into text) compared to phonetic waves vibrates with different frequency.

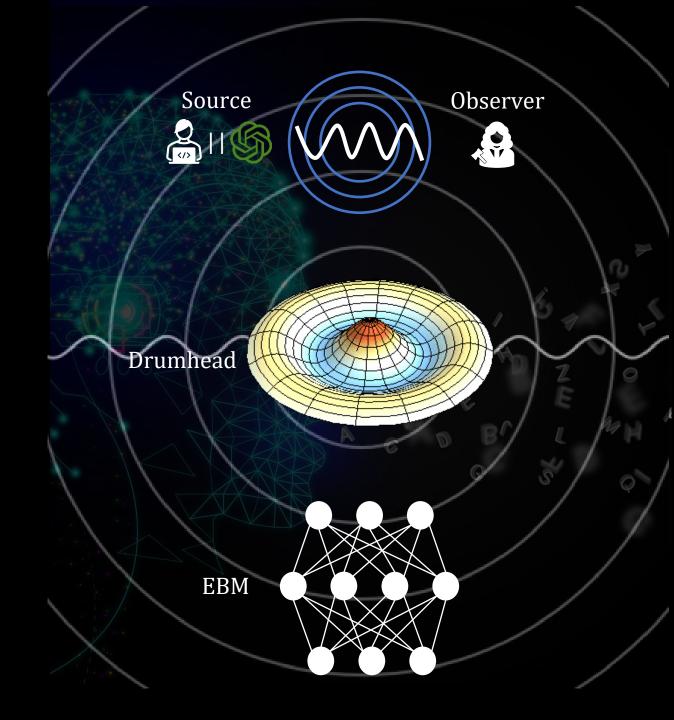
 Machines interact based on predefined rules. Hence, in this case, text strings vibrates with same frequency.

 Thus, human produced content vibrates with high energy and machine generated content vibrates with low energy.



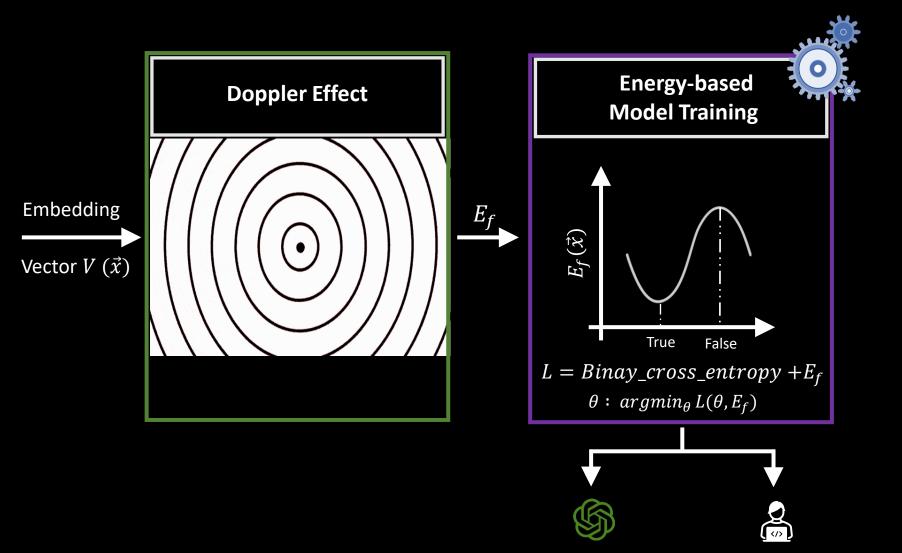
Modeling the Basic Idea

- Doppler effect involves source waves radiating outward in concentric circles towards the Observer.
- Model source frequencies as drumhead vibrations. Diametric waves propagate in concentric circles towards a fixed outer boundary.
- Adopt drumhead vibrations to model waves and source frequency.
- Train an Energy-Based Model (EBM) and integrate the observed frequency as an energy value.
- Finally, using XAI to counter hybrid rephrasing.



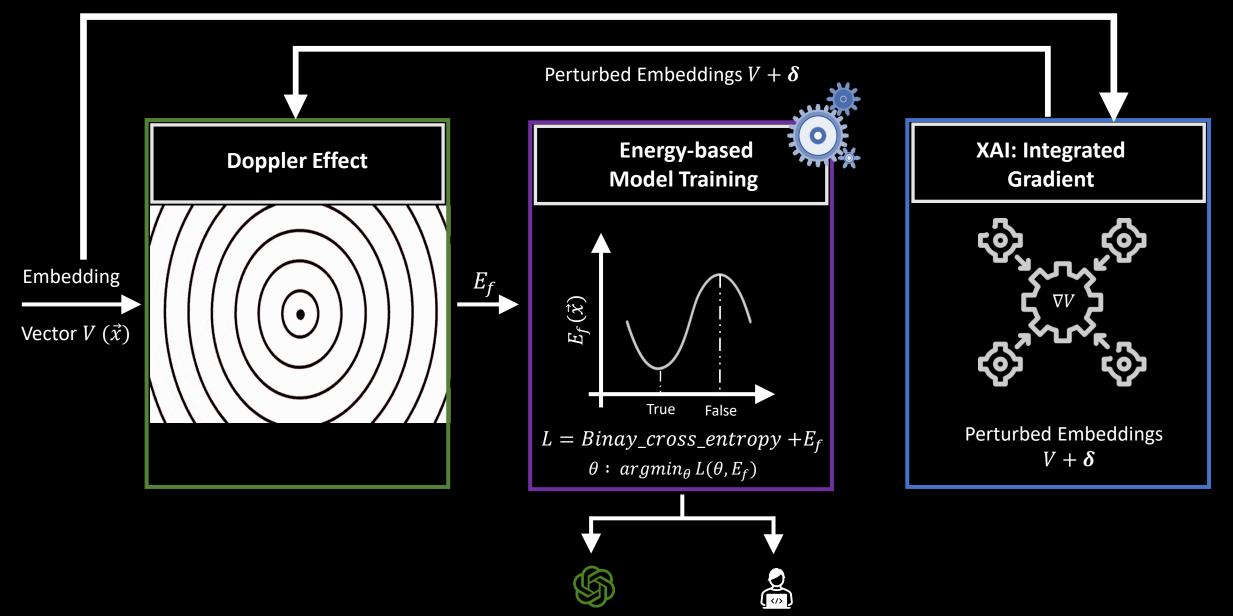


Core Components

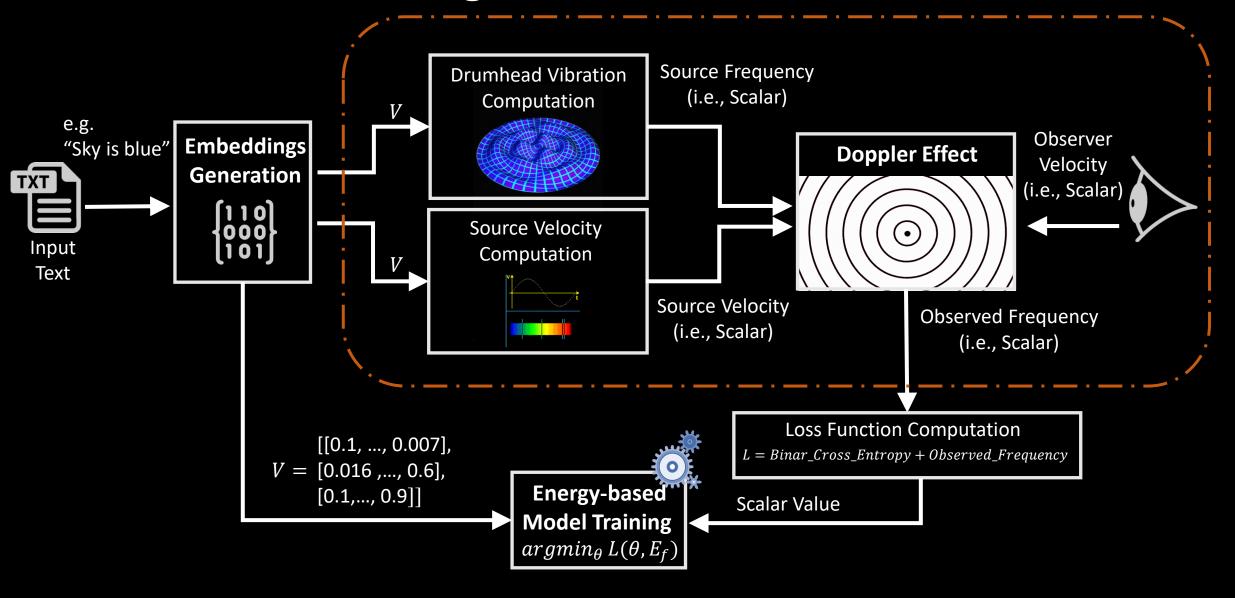


Core Components

Embedding $V \coloneqq [v_1, v_2, \dots, v_k]$

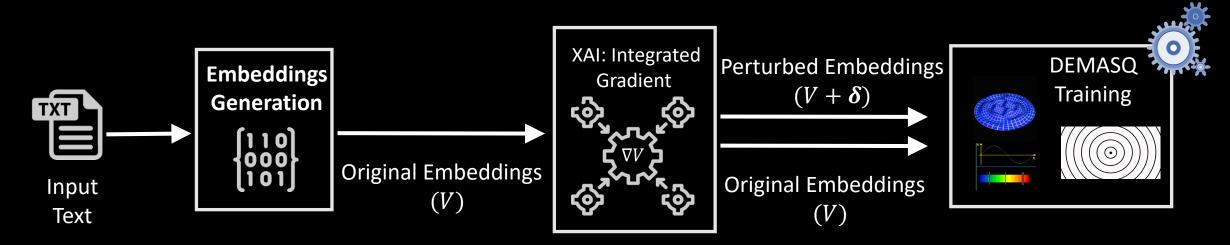


DEMASQ: Training

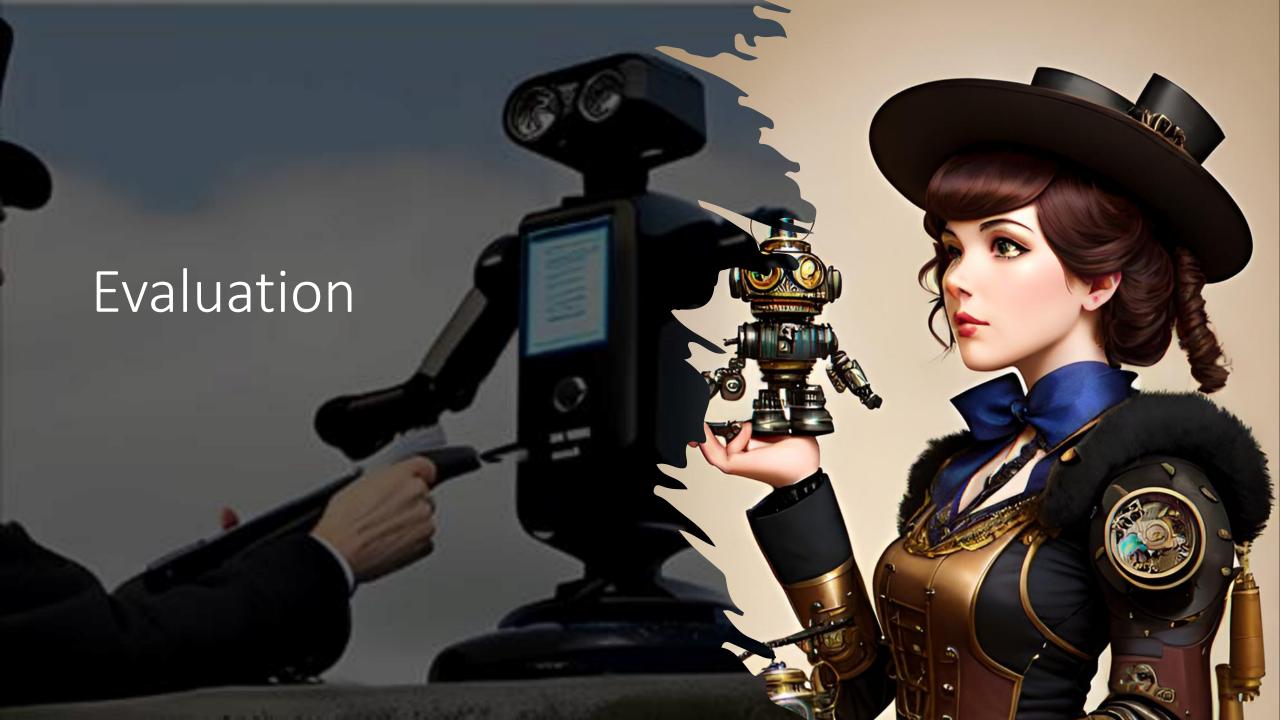


DEMASQ: Hybrid Text

Generate hybrid text (Zombie text)
Blue is the dominant color of the sky
The sky's color is a vibrant shade of blue
The sky's color exhibits a vibrant shade of blue
The sky's color exhibits a vibrant shade of blue



e.g., "The color of the sky is vibrant blue"



Benchmark Datasets

Dataset	Human Records	Al Records	Medical	\$ Finance	News News	Research	(A) Q&A	Wikipedia	Blog	Total Samples
Writefull AI	N.A.	N.A.				✓				N.A.
GPTZero	N.A.	N.A.			✓	✓	✓			N.A.
CopyLeaks	20,000	N.A.				✓				N.A.
Originality,ai	N.A	N.A.							\checkmark	~1M
OpenAl Classifier	~1,100,000	N.A.						✓	✓	~1M
Gao et al. BioRxiv 2022	250	250				✓				500
Liu et al. arXiv 2023	300,000	300,000				✓				600,000
Mitrovic et al. arXiv 2023	1,000	1,395							✓	2,395
Guo et al. arXiv 2023	58,546	26,903	✓	✓			✓	✓	✓	85,449
Mitchell et al. arXiv 2023	~3,000	~12,000	✓		✓			✓	✓	~15,000
Desaire et al. CELL 2023	434	905				✓				1,339
Pegoraro et al. arXiv 2023	59,214	74,964	✓	✓	✓	✓	✓	✓	✓	134,178

Evaluation



Results for DEMASQ trained on different datasets

Dataset		Records	TPR (%)	TNR (%)	
€	Medical	4,992	96.6	96.4	
\$ \$	Finance	15,732	94.6	92.7	
NEWS	News	3,620	95.2	87.7	
	Research	2,664	87.1	91.7	
	Q&A	4,748	73.9	75.4	
A STATE OF THE STA	Wiki	3,368	78.5	85.8	
© C	Blog	99,054	100.0	100.0	
Total		134,178	97.0	96.5	

Evaluation



Results for DEMASQ trained on different datasets of abstracts

Liu et al. arXiv 2023	Records	TPR (%)	TNR (%)
TASK 1: Create Abstract from Title	100,000	94.7	97.9
TASK 2: Complete Abstract from initial segment	100,000	88.7	88.4
TASK 3: Rephrase Abstract	100,000	84.3	81.0

BIAS in TASK 1

BIAS in TASK 3

	Record	Label		Record	Label
99990	One of the main challenges that the Semantic W	1	99990	In this paper we consider Basis Pursuit De-Noi	1
99991	This paper presents a new probabilistic approa	0	99991	The paper discusses a problem called Basis Pur	0
99992	AI systems typically make decisions and find p	1	99992	In this work, dynamic Bayesian multinets are i	1
99993	This paper proposes an efficient lineage appro	0	99993	This paper introduces dynamic Bayesian multine	0
99994	An important form of prior information in clus	1	99994	We examine a standard factory scheduling probl	1
99995	This paper presents a novel approach for solvi	0	99995	This study focuses on a factory scheduling pro	0
99996	Third-party services form an integral part of	1	99996	The paper proposes a novel upper confidence bo	1
99997	This paper investigates the mobile advertising	0	99997	This paper introduces a new method called the	0
99998	Scientific discoveries are increasingly driven	1	99998	We address the problem of quantifying the cryp	1
99999	This paper presents a comparative evaluation o	0	99999	This paper addresses how to measure the level	0

Evaluation

$$TPR = \frac{TP}{TP + FN} \qquad TNR = \frac{TN}{TN + FP}$$

Results for DEMASQ and CheckGPT on the rephrased datasets

Rephrased Liu et al. arXiv 2023	Records	CheckGPT		DEMASQ	
		TPR (%)	TNR (%)	TPR (%)	TNR (%)
TASK 1: Create Abstract from Title	100,000	82.7	99.7	93.0	94.1
TASK 2: Complete Abstract from initial segment	100,000	56.3	96.1	83.4	84.5
TASK 3: Rephrase Abstract	100,000	3.8	99.0	74.9	75.1

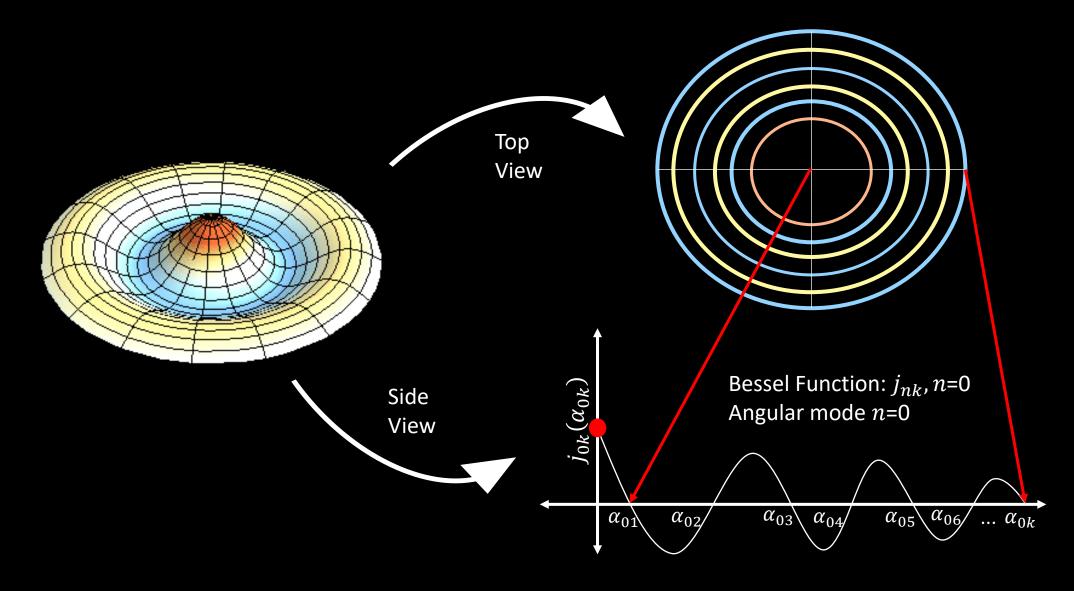
Conclusion

- Proposed a novel detection method DEMASQ to accurately detect the ChatGPTgenerated text.
- Incorporates the effects introduced by various factors during human interactions with other humans or machines.
- Considers rephrasing techniques employed by humans to modify ChatGPT-generated responses and evade detection.
- Evaluations on a comprehensive benchmark dataset comprising over 100,000 samples, which covers diverse domains.



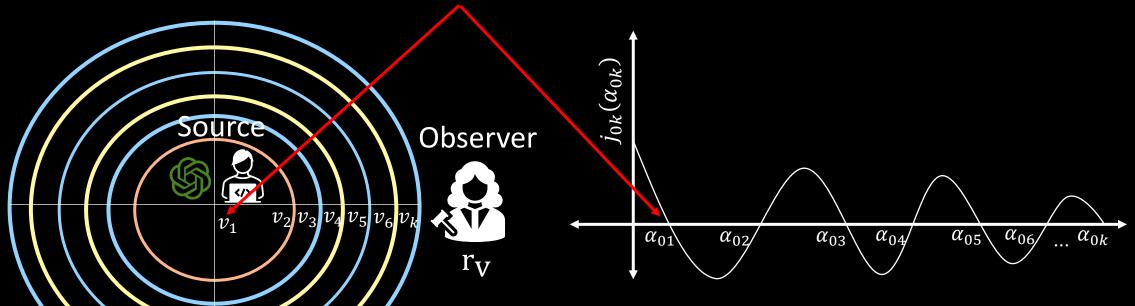
Additional information

Drumhead Vibration



Analogy: Computing Observed Frequency

Embedding $V = [v_1, v_2, \dots, v_k]$



Source Frequency

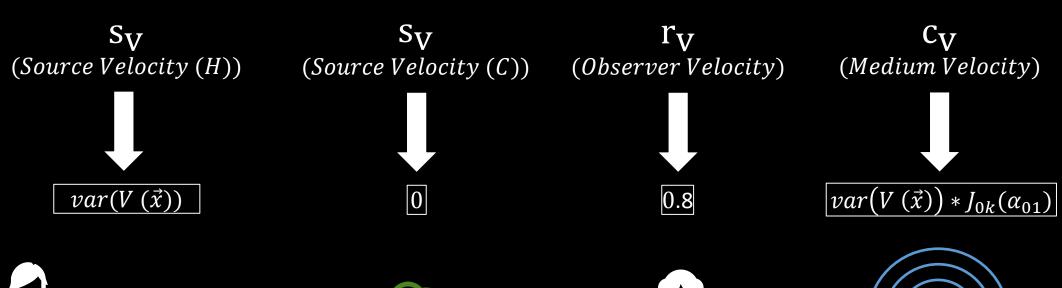
$$E_{f_S} = \frac{\alpha_{0k}}{\alpha_{01}}$$



Observed Frequency

$$E_f = \frac{c_V + r_V}{c_V - s_V} * E_{f_S}$$

Doppler Effect









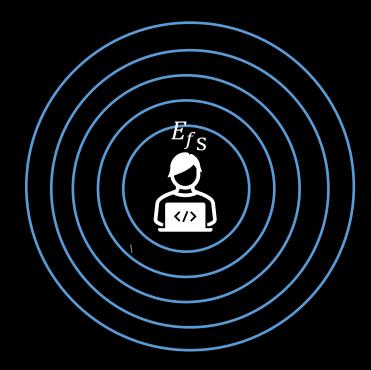


Observed Frequency

$$E_f = \frac{c_V + r_V}{c_V - s_V} * E_{f_S}$$

Doppler Effect

 $S_{\mathbf{V}}$ Source Human



 $r_{\mathbf{V}}$ Observer

 $S_{\mathbf{V}}$ Source ChatGPT

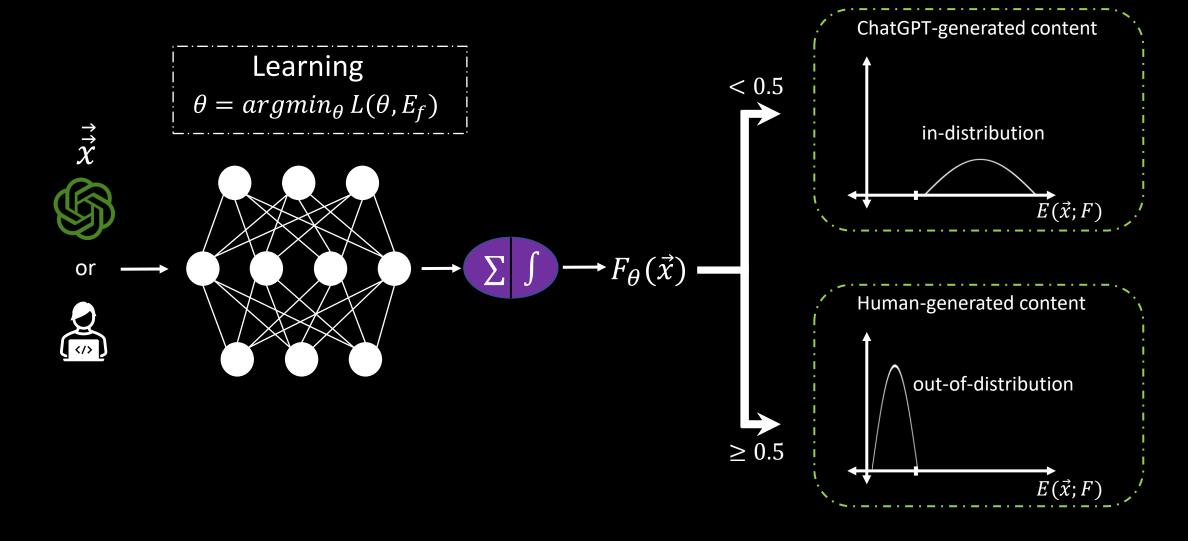




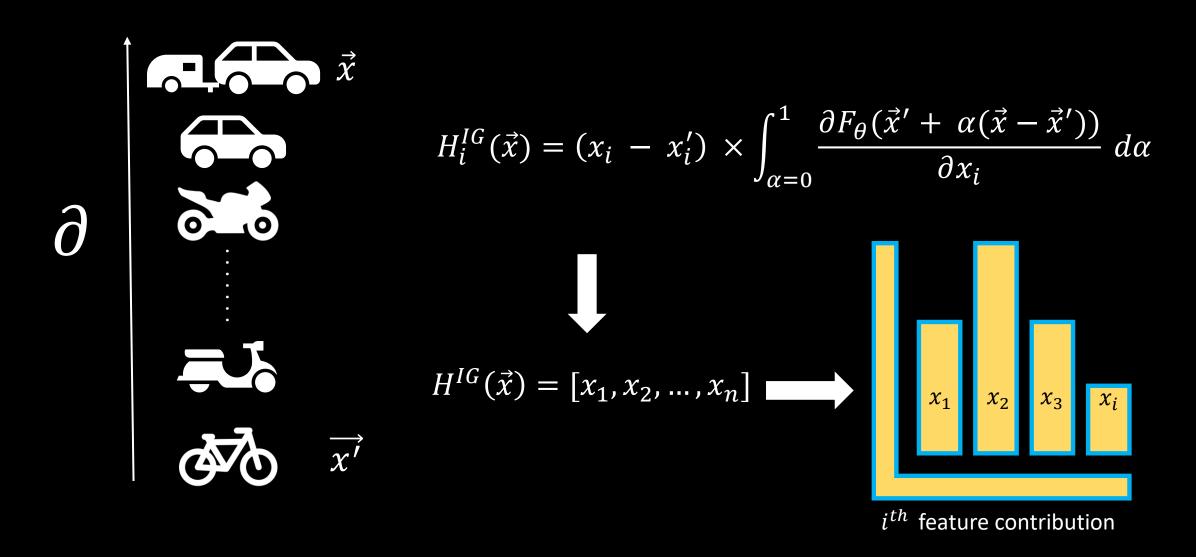
Source (ChatGPT or human) frequency

 $F_{fs}: Source (ChatGP)$ $c_{V}: Medium velocity$ $E_{f}: Observed f$ Observed frequency

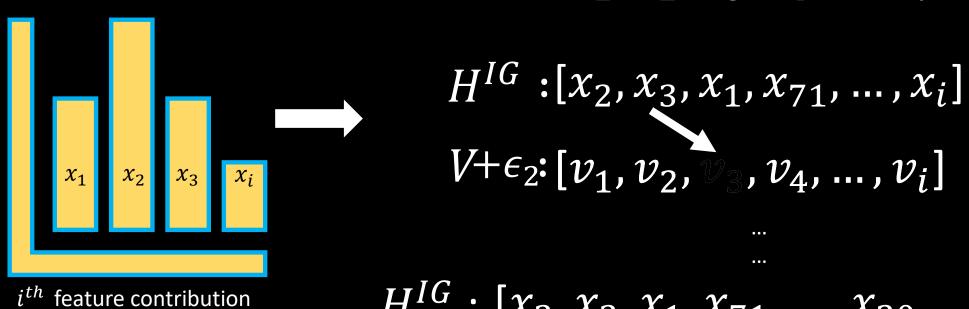
Energy-Based Model (EBM)



Integrated Gradient



Perturbing *V*



 $H^{IG}:[x_2,x_3,x_1,x_{71},...,x_i]$ $V+\epsilon_1:[v_1,v_2,v_3,v_4,...,v_i]$

$$H^{IG}:[x_2,x_3,x_1,x_{71},...,x_i]$$

$$V+\epsilon_2$$
: $[v_1, v_2, v_3, v_4, \dots, v_i]$

$$H^{IG}: [x_2, x_3, x_1, x_{71}, ..., x_{20}, ..., x_i]$$
 $V+\epsilon_{20}: [v_1, v_2, v_3, v_4, ..., v_{20}, ..., v_i]$