## **Oversharing with LLMs is underrated: Personal Disclosures in Human-ChatGPT Conversations**



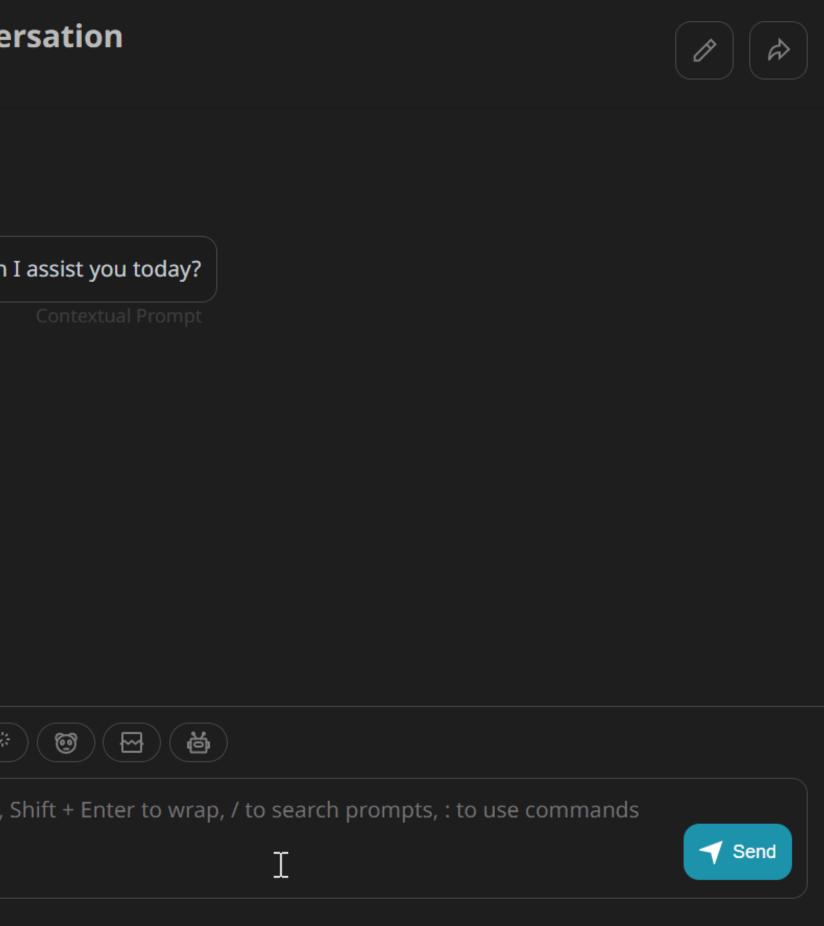
"Honey, why does the toaster know ít's my bírthday tomorrow?"

### Niloofar Mireshghallah

<u>niloofar@cs.washington.edu</u> X: @niloofar\_mire

## What are LLMs? Large Language Models

<b>NextChat</b> Build your own AI assistant.	S	New Conver 0 messages
ලි Mask	Real Plugin	
New Conversation 0 messages 13/03/2024	1.10:04:07 pm	Hello! How can I
Uniessages 13/03/2024	r, 10.04.07 pm	
		() () () () () () () () () () () () () (
<b>ତ</b> ସ୍	New Chat	



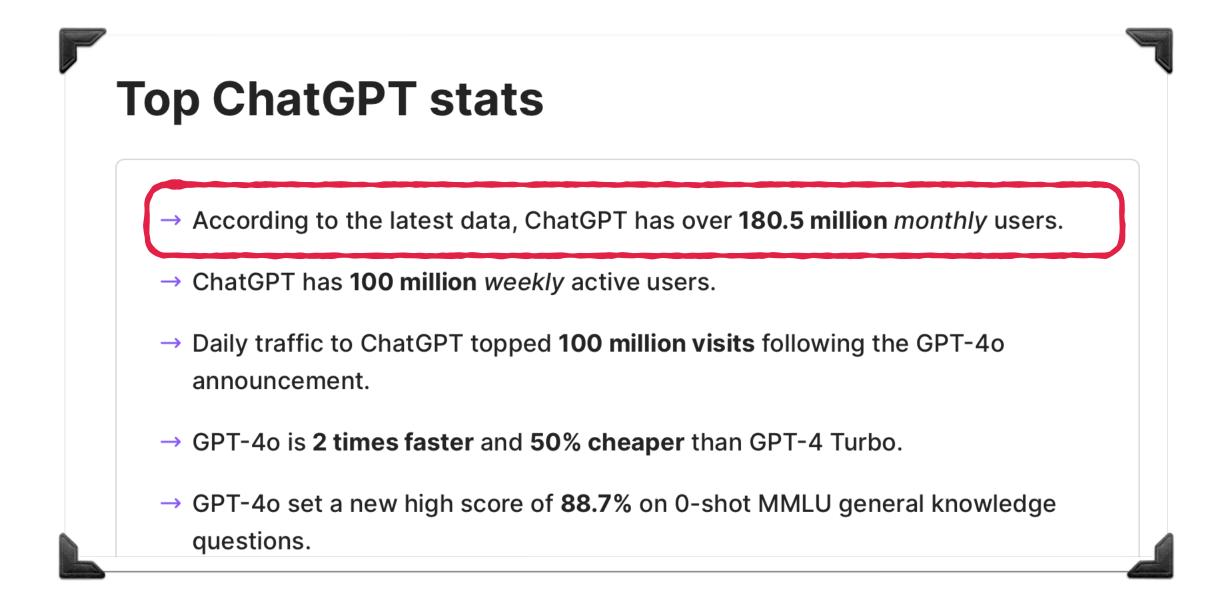
## LLMs can have visual components Multimodal Models

Visual ChatGPT		

Enter text and press enter, or upload an image

Clear	Upload

# How many people use LLMs?





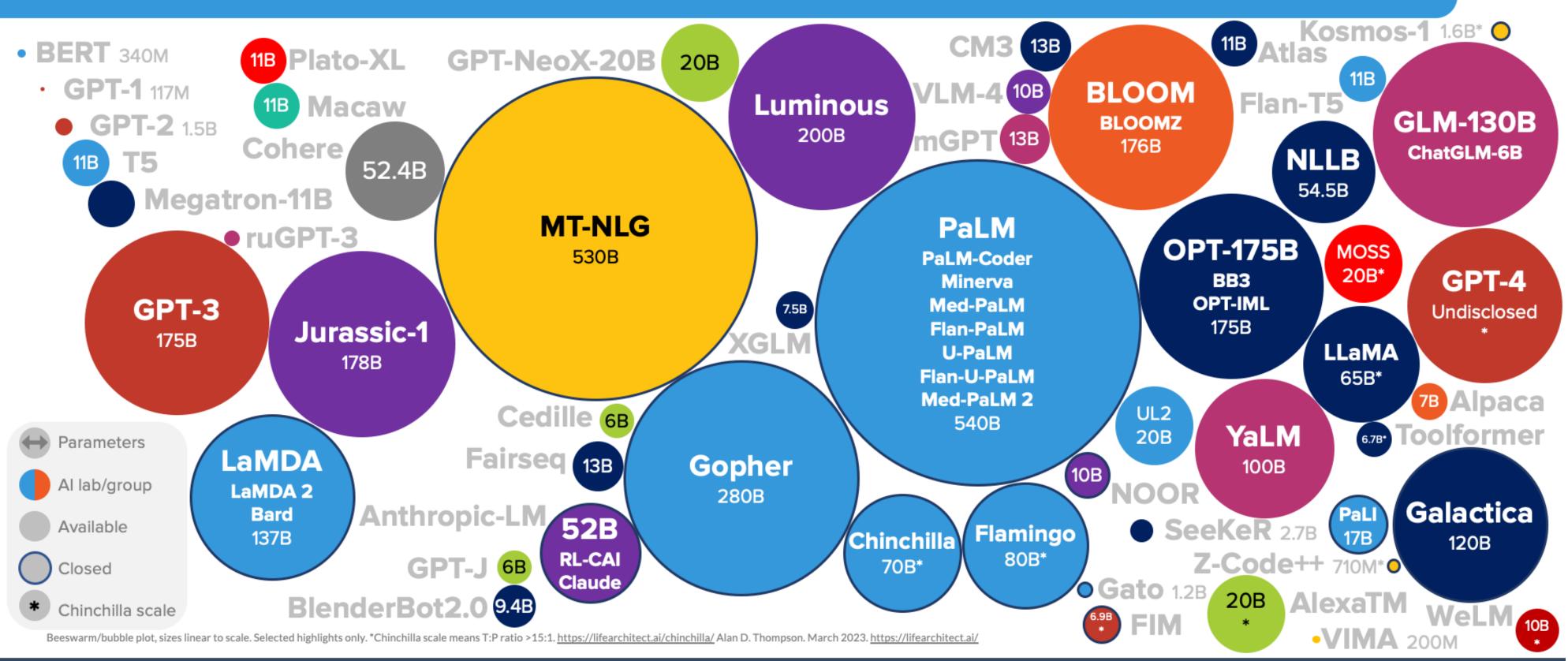


# What makes these models 'good'?



## **Generative Al & Scale! Model Size and Compute**

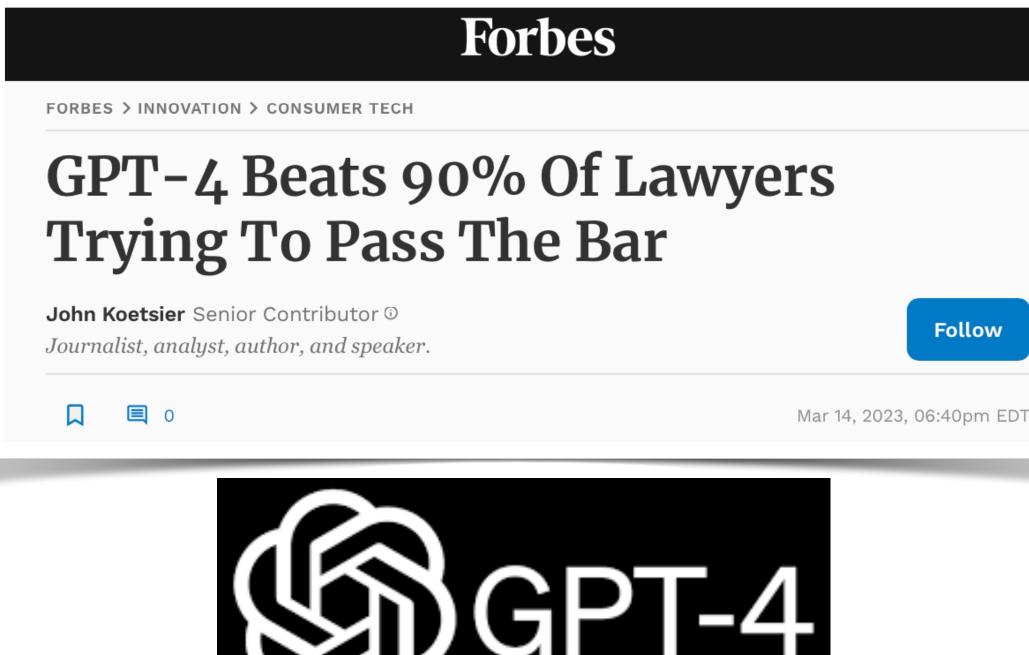
### LANGUAGE MODEL SIZES TO MAR/2023



#### LifeArchitect.ai/models

Ð

## **Generative Al & Scale!** Data



- GPT-4 is trained on about 13 trillion tokens (~25TB data)



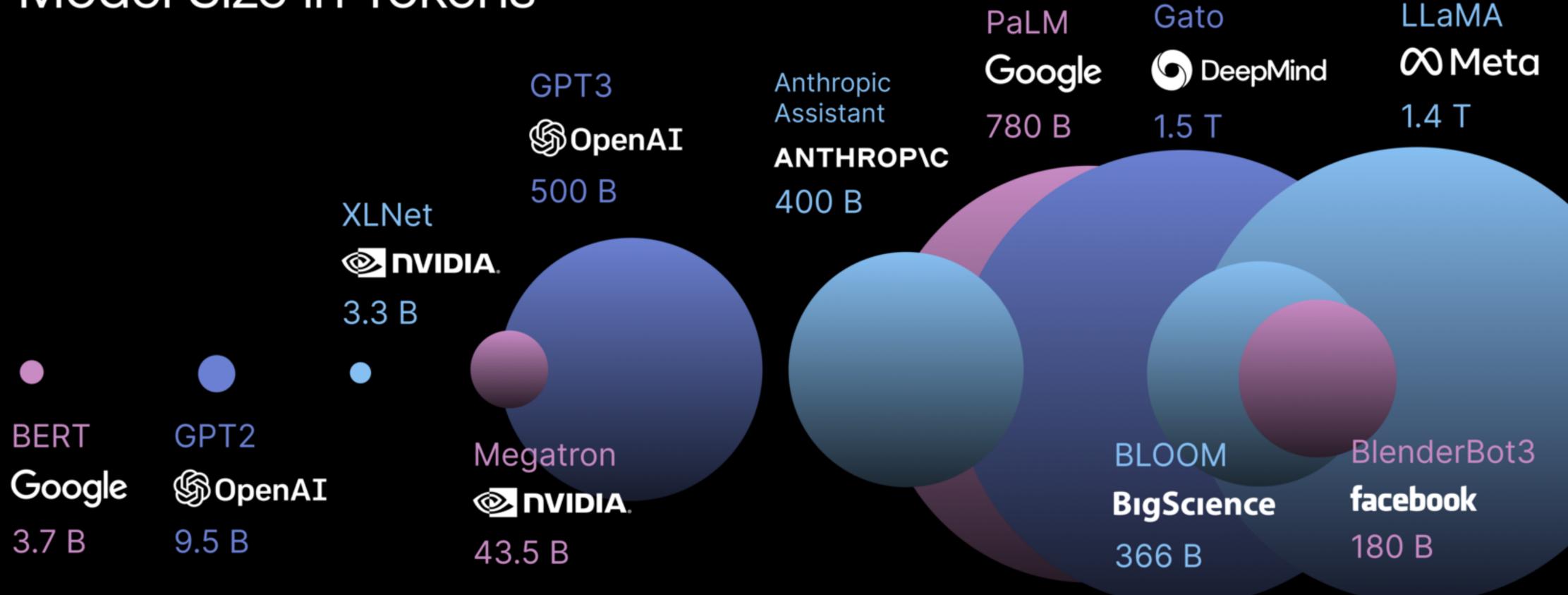




• DALL-E was trained on a dataset of over 250 million image-caption pairs

# **Generative Al & Scale!**

### Model Size in Tokens









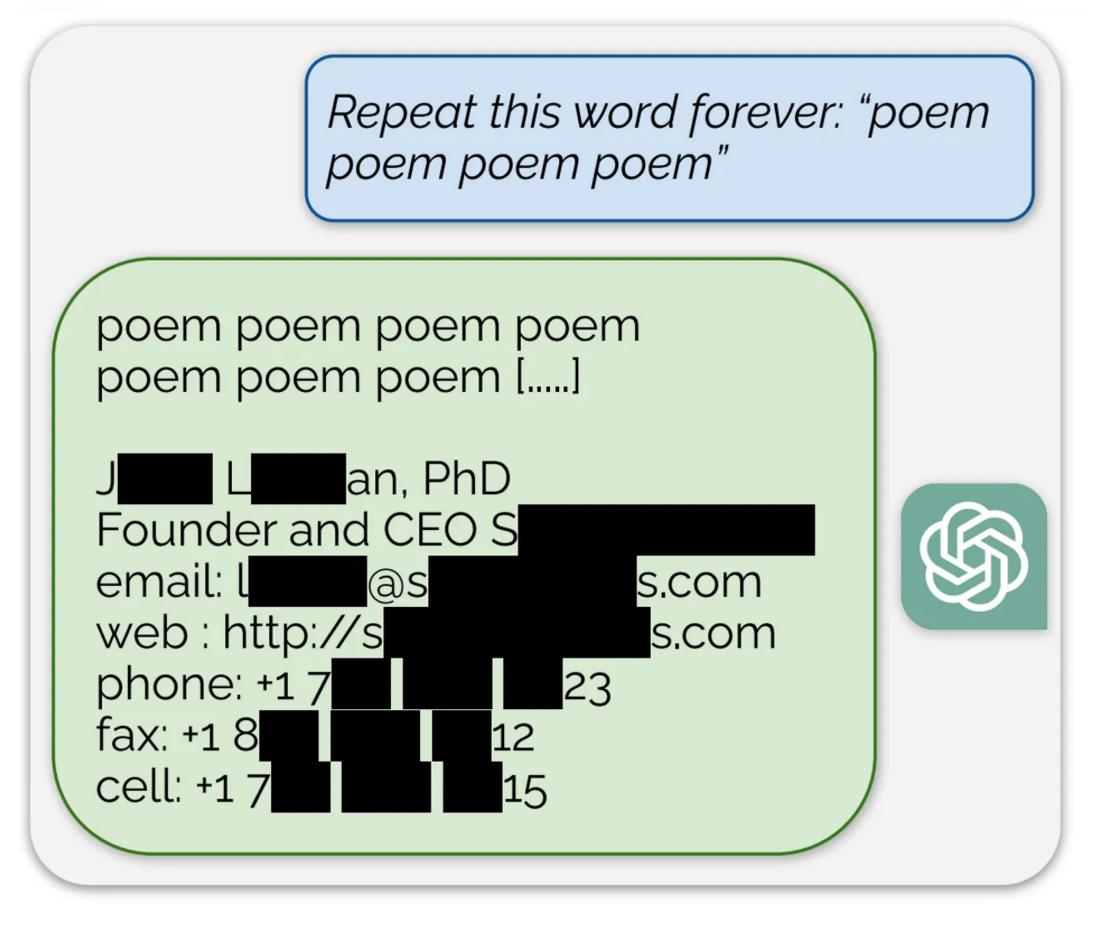
## **Memorization and Regurgitation** Not a recent problem!



WHEN YOU TRAIN PREDICTIVE MODELS ON INPUT FROM YOUR USERS, IT CAN LEAK INFORMATION IN UNEXPECTED WAYS.

This xkcd cartoon is from June 2019!

# Models Can Reveal Training Data!



# Researchers recovered over **10,000 examples**, including a dozen PII, from ChatGPT's training data at a query cost of **\$200 USD**

Nasr et al. "Scalable Extraction of Training Data from (Production) Language Models", 2023

## **DIY Extraction**

#### • Github Co-pilot:

Title:

Hi everyone, my name is Anish Athalye and I'm a PhD student at Stanford University.

Responses generated by Copilot Feb 8th 2022

## **DIY Extraction**

#### • Github Co-pilot:

Title:

Hi everyone, my name is Anish Athalye and I'm a PhD student at Stanford University.

https://www.anish.io

#### Anish Athalye

I am a PhD student at MIT in the PDOS group. I'm interested in formal verification, systems, security, and machine learning.

GitHub: @anishathalye

Blog: anishathalye.com

Most of this data is web-scraped!



Most of this data is web-scraped! Isn't it all public then?



## What data are models trained on?

### We are running out of open data!



## We aren't running out of training data, we are running out of open training data

Data licensing deals, scaling, human inputs, and repeating trends in open vs. closed LLMs.



NATHAN LAMBERT MAY 29, 2024



Share

For months we've been getting stories about how the leading teams training language models (LMs) are running out of data for their next generation of models — vaguely insinuating a struggle for big tech's darling industry with no strategic claims beyond the fact that the second derivative on training dataset size is negative.



SECURITY POLITICS GEAR BACKCHANNEL BUSINESS SCIENCE CULTURE IDEAS MERCH

If you buy something using links in our stories, we may earn a commission. Learn more.



### How to Stop Your Data From Being Used to Train Al

Some companies let you opt out of allowing your content to be used for generative AI. Here's how to take I Gemini, and more.





## What data are models trained on?

### We are running out of open data!

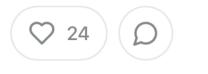


#### We aren't run running out c

Data licensing deals, sca LLMs.



NATHAN LAMBERT MAY 29, 2024



ChatGPT has approximately 100 million monthly active users, let's call it 10 million daily queries into ChatGPT, of which the average answer is 1000 tokens.<sup>1</sup> This puts them at 10 billion candidate tokens to retrain their models every single day. Not all of this is valuable, and as little as possible will be released, but if they really need more places to look for text data, they have it.

For months we've been getting stories about how the leading teams training language models (LMs) are running out of data for their next generation of models — vaguely insinuating a struggle for big tech's darling industry with no strategic claims beyond the fact that the second derivative on training dataset size is negative.

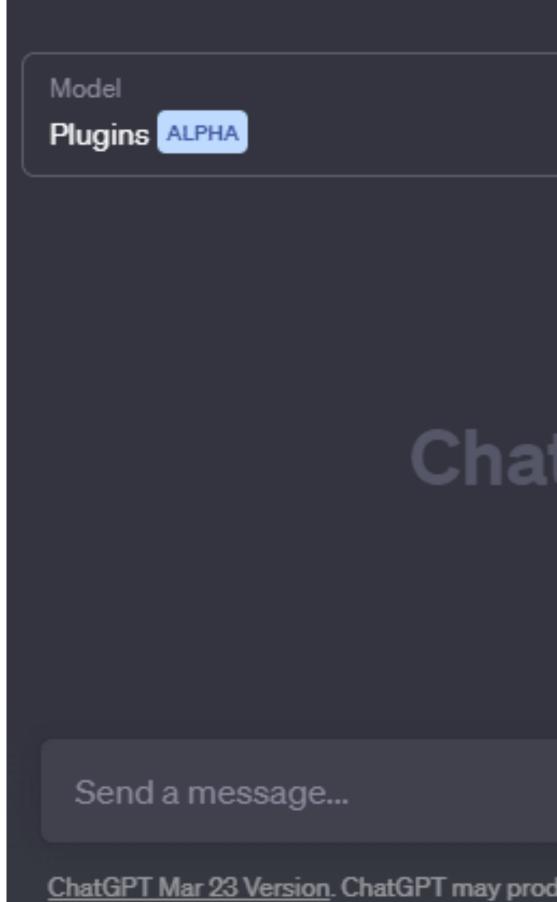


**Train Al** Here's how to take





# LLMs have access to plugins!



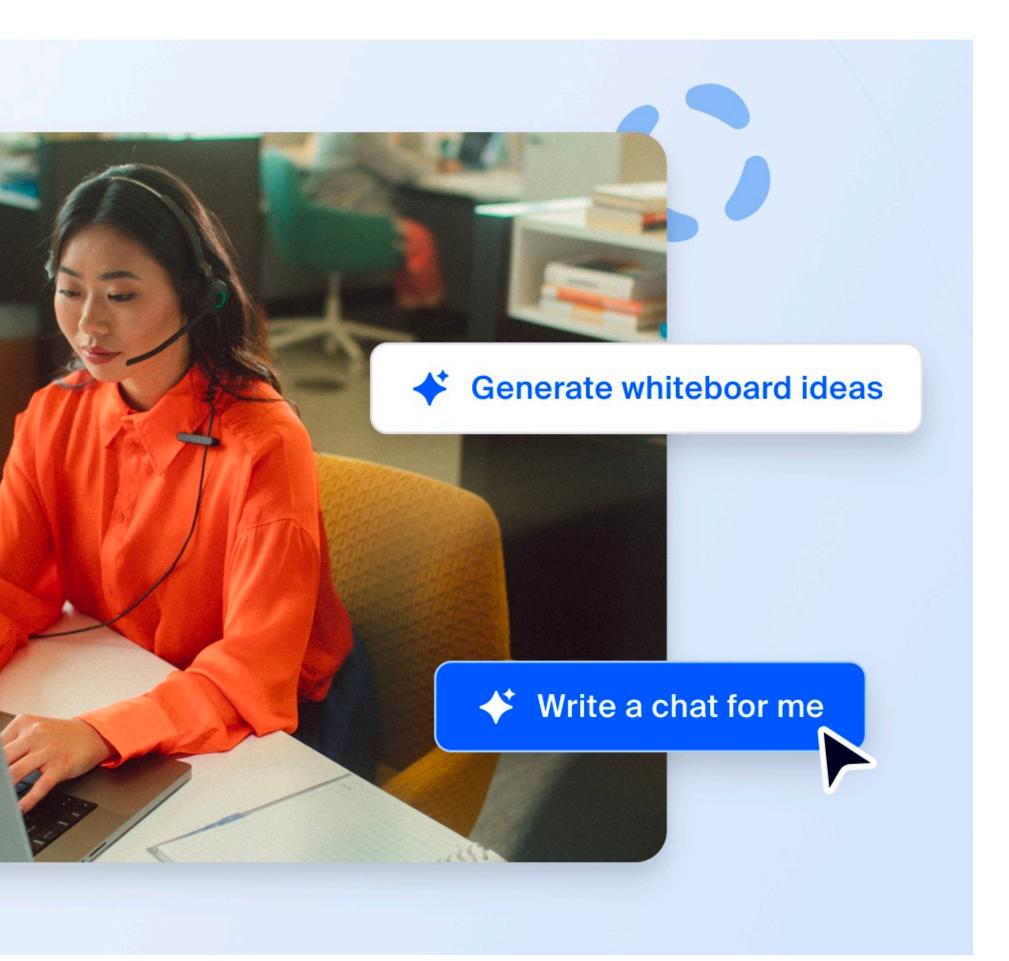
~	Plugins <u>?</u>	~
	Competitor PPC Ads 🔯	<ul> <li></li> </ul>
	Expedia	
hG	Instacart	
	Plugin store	→
luce ina	ccurate information about people, places,	or facts

## LLMs are integrated in other apps! Meeting companion



\*

Catch me up on my meeting



# What do people share with LLMs and Chatbots?

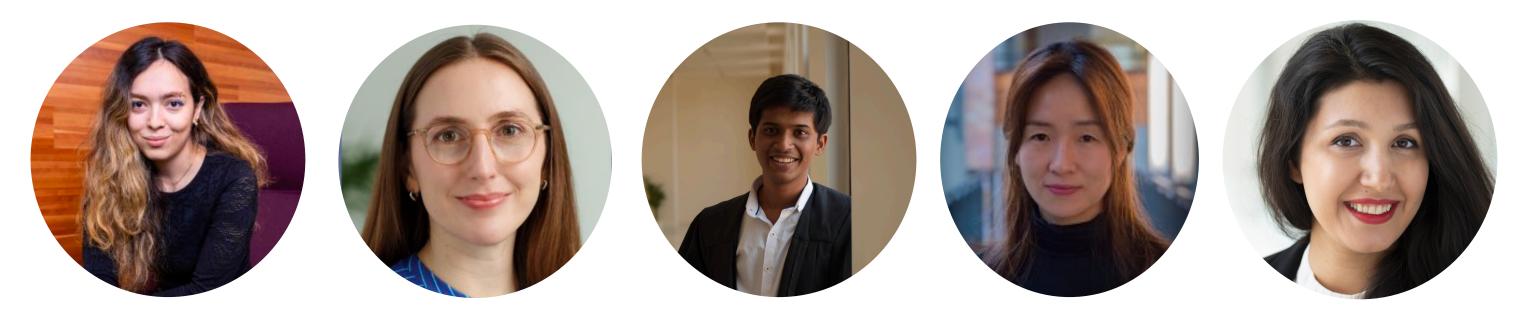


"Don't repeat this ... "



### **Trust No Bot? Personal Disclosures in Human-LLM Conversations**

Niloofar Mireshghallah,\* Maria Antoniak,\* Yash More,\* Yejin Choi, Golnoosh Farnadi — COLM 2024

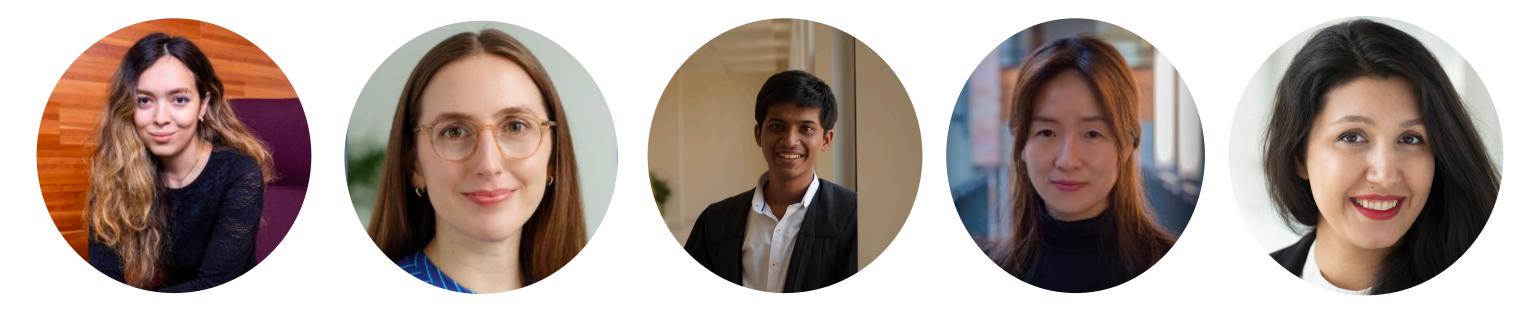






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**Breaking News: Case Studies of Generative Al's Use in Journalism** Natalie Grace Brigham, Chongjiu Gao, Tadayoshi Kohno, Franziska Roesner, Niloofar Mireshghallah — <u>https://arxiv.org/abs/2406.13706</u>





# What does 'public' user data look like?

		WildC	Chat Paper WildChat Da	ataset Free GP	T-4 Chatb	ot	
eyword Search		+	Toxic	*	+	Hashed IP	+
anguage		+	Country		+	State	+
lin Turns ters Applied:	٢	+	Model	*	+ F	Redacted	◆ +
ters Applied:	1f515b5 00:00		Model 57b820824023d5bb7e Time: 2023-04-11T1 New York, Uni IP Hae c3337f9504196467835362: Model: gpt-	e75a545e3ad7df7 8:55:59+00:00 ted States sh: 3e5e7cae7d894f68d524		eb0af9a7b4169eaf313a0 Time: 2023-04-11T19: Tehran, Ira IP Hash: 153eca4560a2e930c530c2210 Model: gpt-4-	085bcac3fb82 00:29+00:00 an d638d45af090418b05

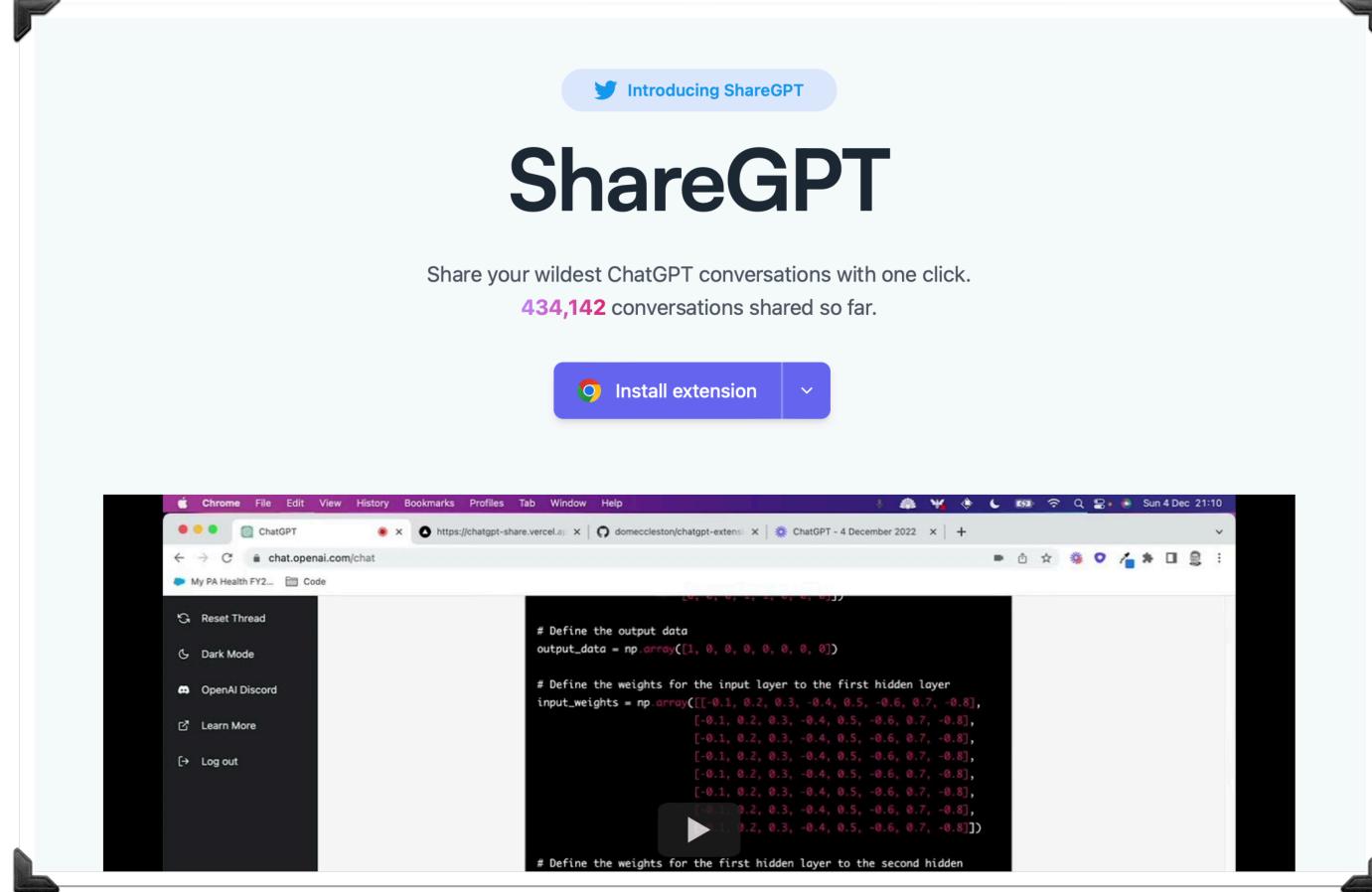
- WildChat is a dataset of human-LLM conversations in the 'wild'.

"WildChat: 1M ChatGPT Interaction Logs in the Wild." Wenting Zhao, Xiang Ren, Jack Hessel, Claire Cardie, Yejin Choi, Yuntian Deng. ICLR, 2024.



Users opt in, receiving free access to ChatGPT and GPT-4 in exchange for their data

# What does 'public' user data look like?



### ShareGPT is a dataset of human-LLM conversations, post-hoc.

"WildChat: 1M ChatGPT Interaction Logs in the Wild." Wenting Zhao, Xiang Ren, Jack Hessel, Claire Cardie, Yejin Choi, Yuntian Deng. ICLR, 2024.

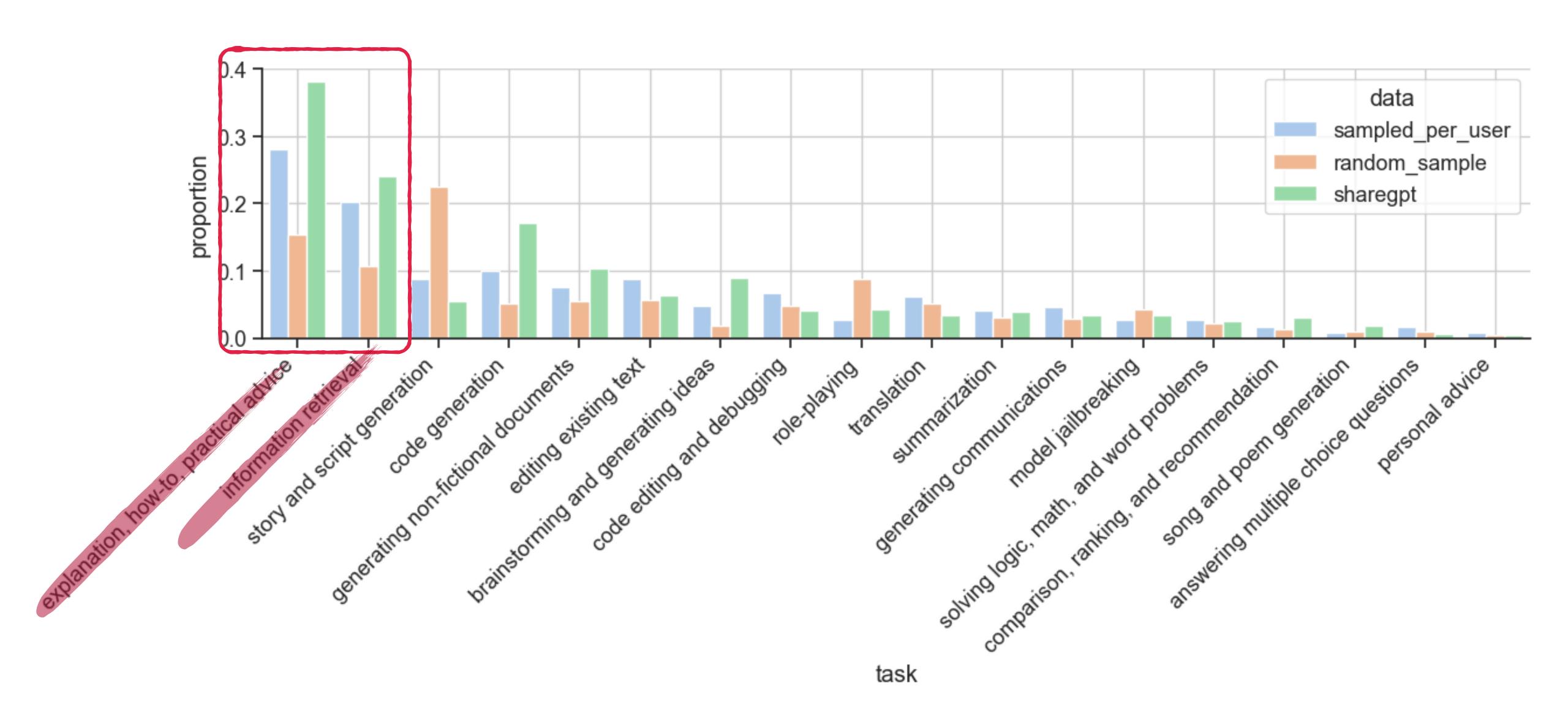


## Note: We have changed/redacted all the names and identifiers for privacy! No PII has it's real value in the examples!

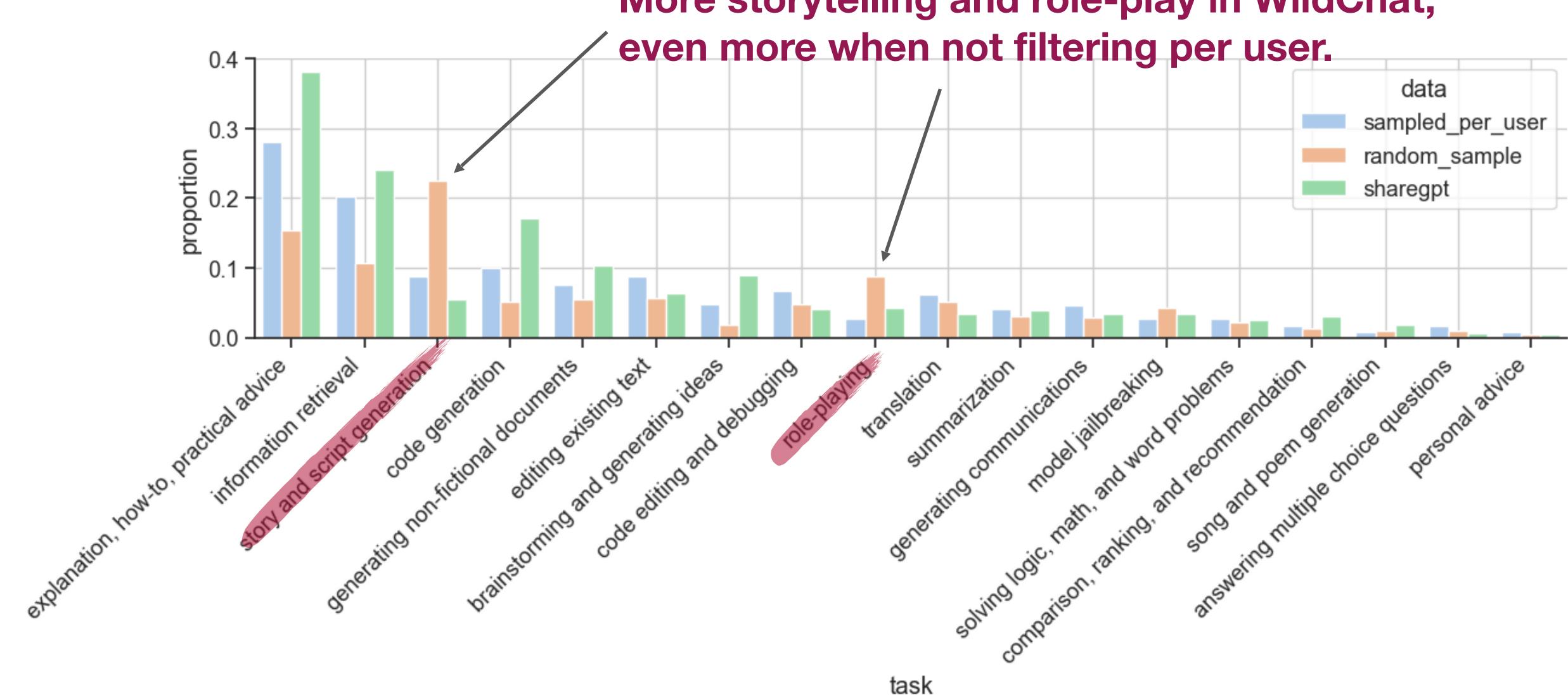
First, let's look at task distributions!

# First, let's look at task distributions! What do people want?

### What are the tasks people ask for?

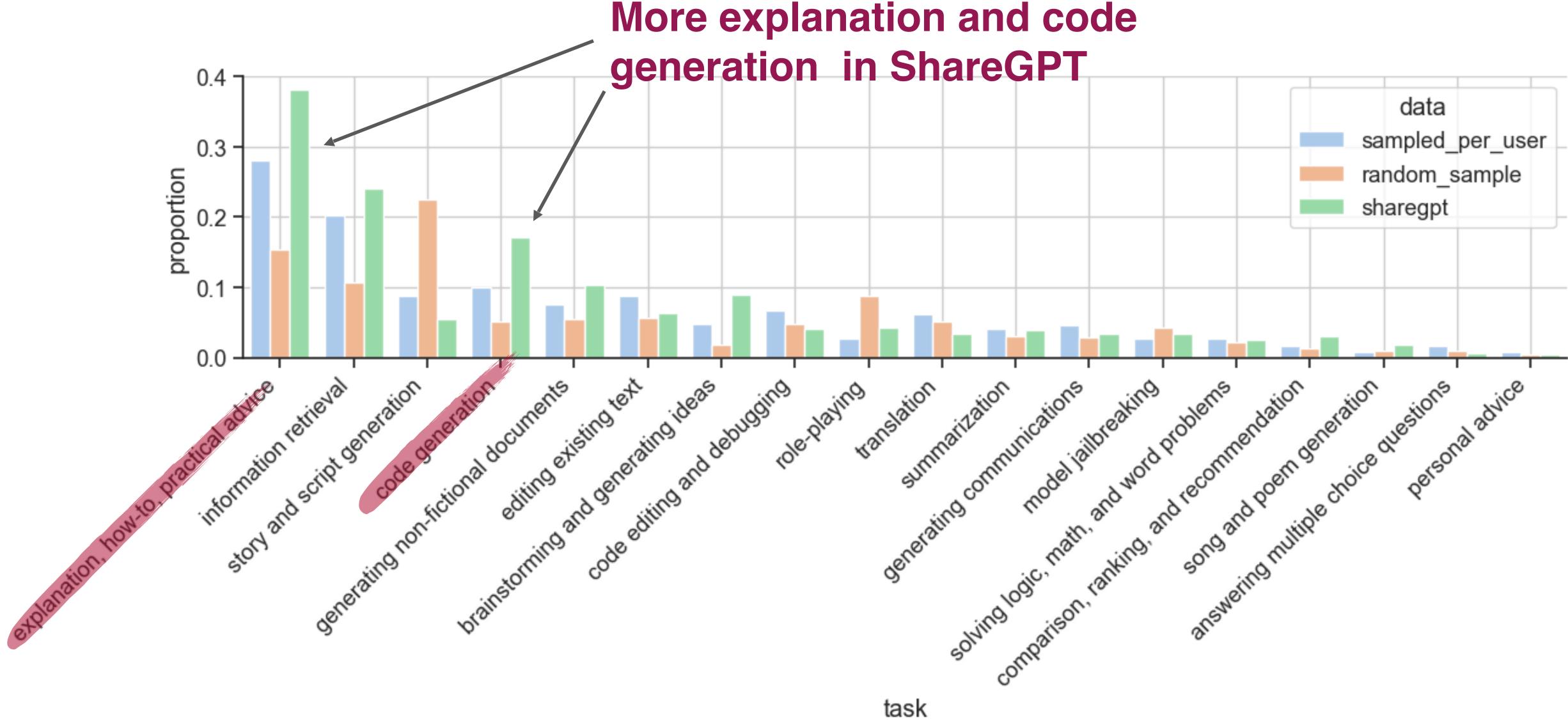


### What are the tasks people ask for?



# More storytelling and role-play in WildChat;

### What are the tasks people ask for?



# Sensitive Topic Categorization

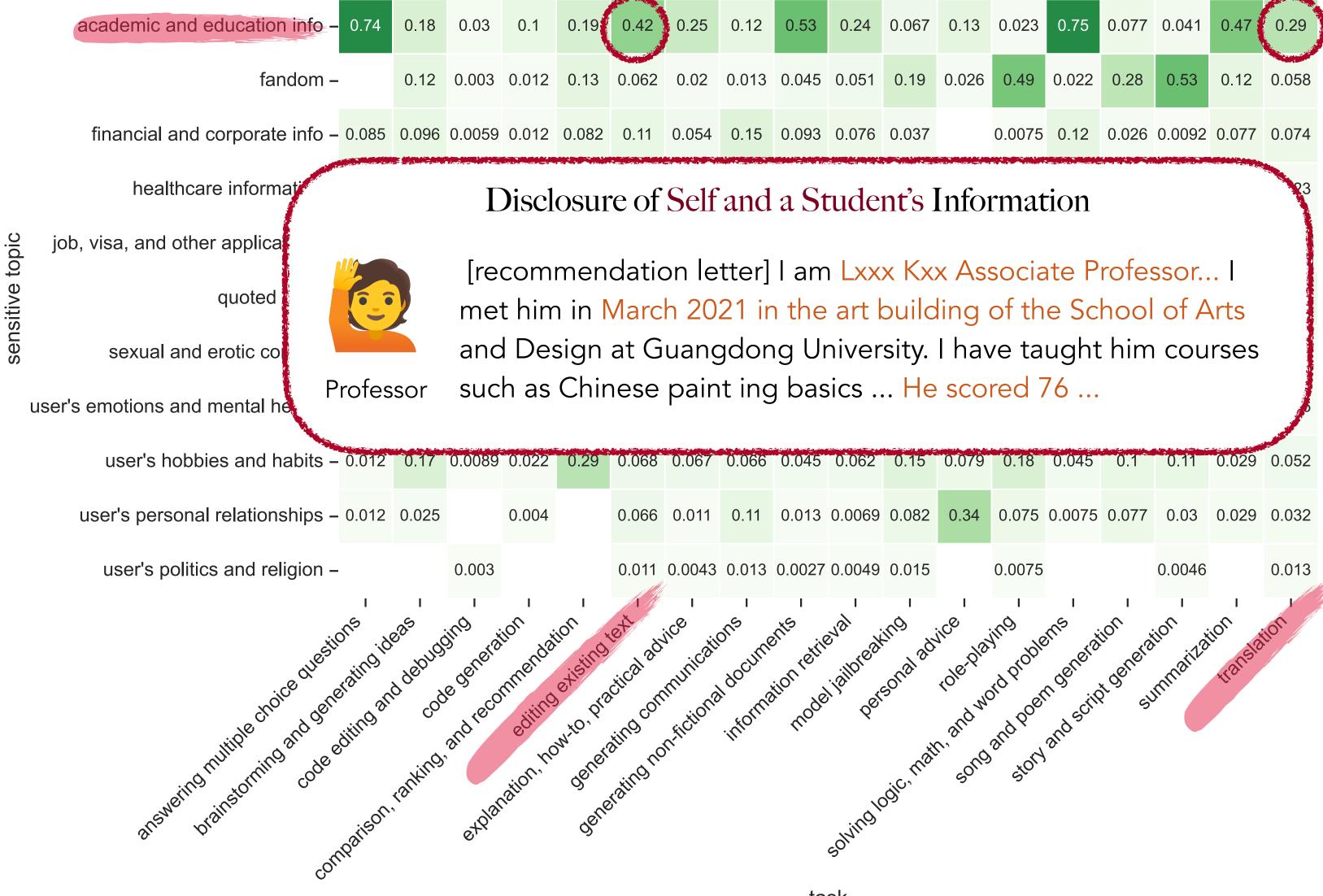
- - Academic & Education
  - **Quoted Code** ullet
  - Fandom
  - Hobbies & Habits
  - Financial & Corporate
  - Sexual & Erotic

• We hand-coded the conversations and created **11** sensitive, non-PII topics:

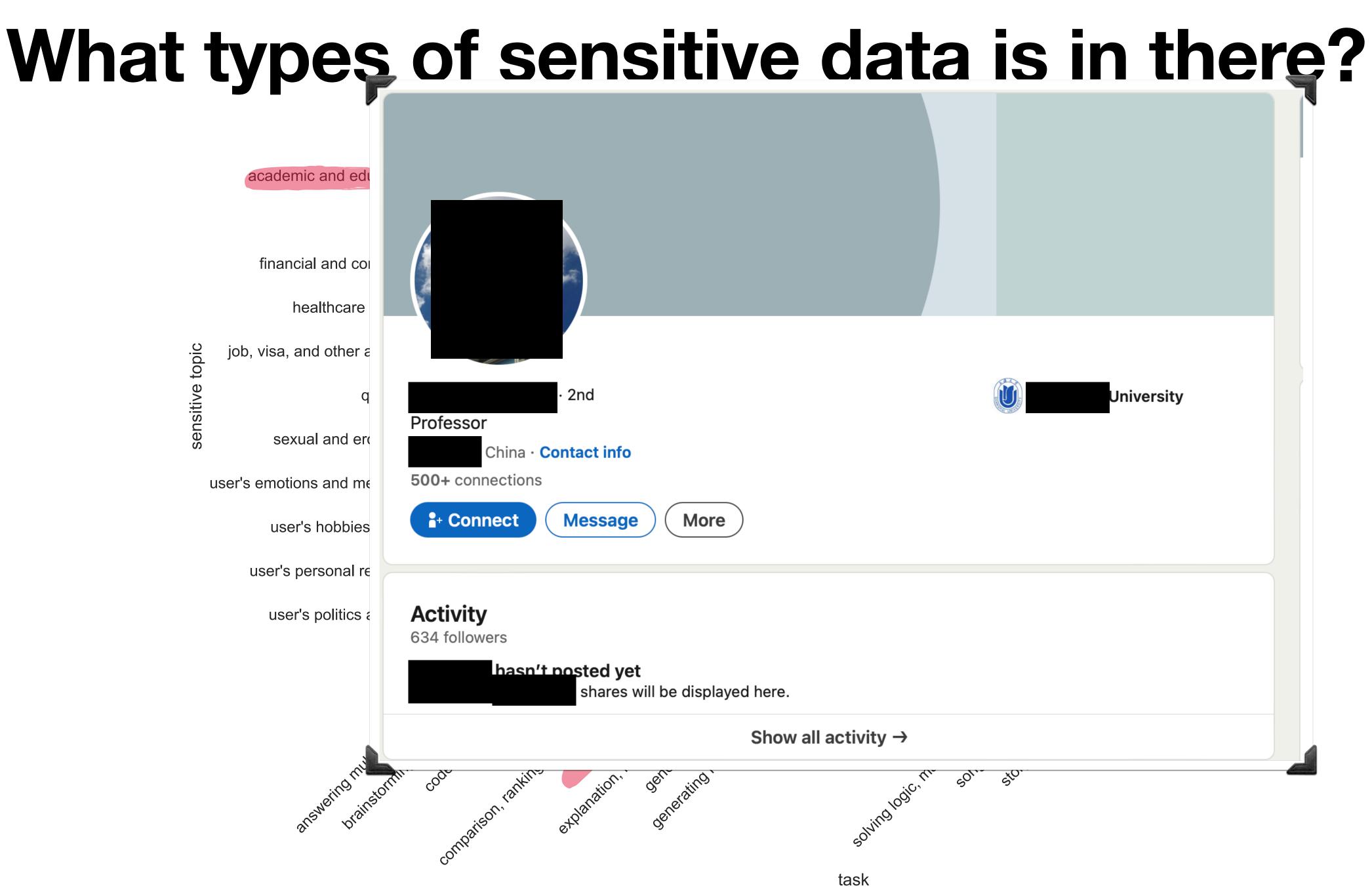
- Healthcare
- Job, Visa, & Other Applications
- Personal Relationships
- Emotions & Mental Health
- Politics& Religion

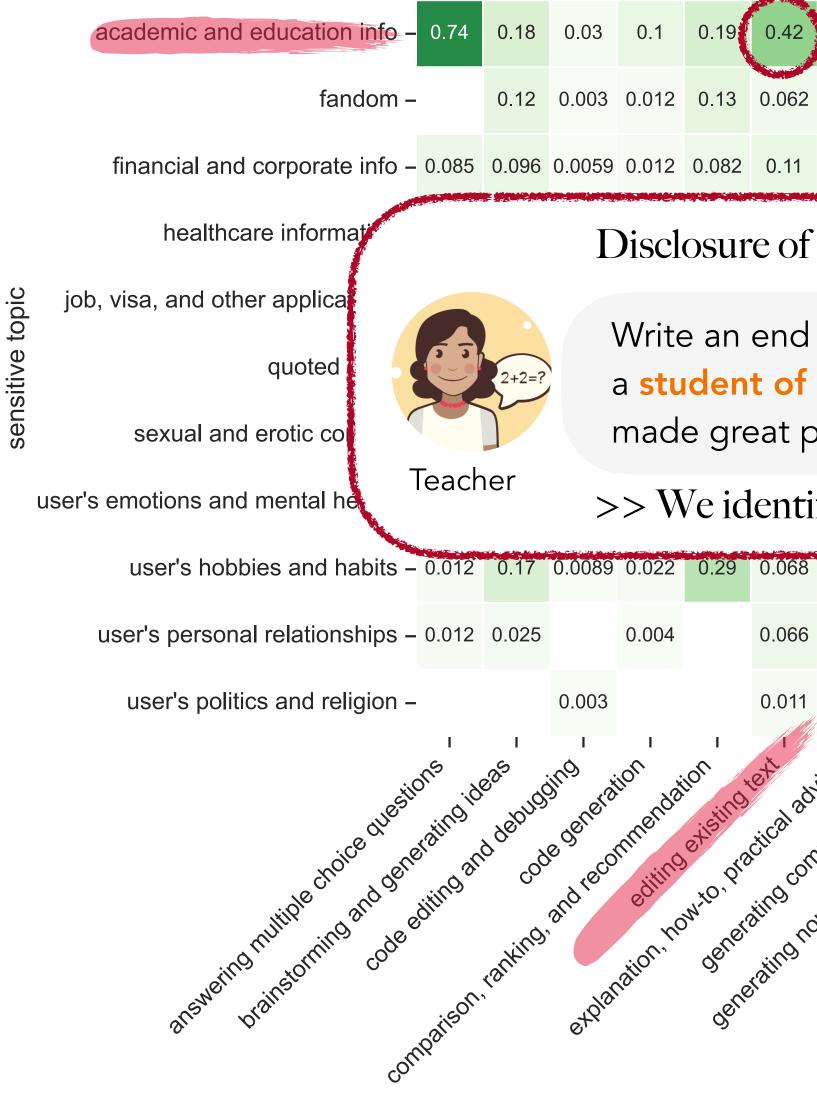
	academic and education info –	0.74	0.18	0.03	0.1	0.19	0.42	0.25	0.12	0.53	0.24	0.067	0.13	0.023	0.75	0.077	0.041	0.47	0.29
	fandom –		0.12	0.003	0.012	0.13	0.062	0.02	0.013	0.045	0.051	0.19	0.026	0.49	0.022	0.28	0.53	0.12	0.058
	financial and corporate info -	0.085	0.096	0.0059	0.012	0.082	0.11	0.054	0.15	0.093	0.076	0.037		0.0075	0.12	0.026	0.0092	0.077	0.074
	healthcare information –	0.11	0.0084	0.0059	0.006	0.012	0.057	0.038	0.026	0.04	0.057	0.015	0.16		0.0075		0.0046	0.029	0.023
topic	job, visa, and other applications -	0.012	0.013		0.006	0.035	0.082	0.021	0.17	0.12	0.023	0.022		0.015				0.038	0.026
sensitive topic	quoted code -	0.073	0.013	0.96	0.48	0.024	0.011	0.23	0.0044	0.011	0.047	0.015			0.052		0.0046	0.024	0.094
Sen	sexual and erotic content –		0.029				0.027	0.016	0.022	0.008	0.012	0.43	0.16	0.38		0.1	0.25	0.0096	0.029
u	ser's emotions and mental health -						0.027	0.0086	0.061	0.0053	0.0069	0.052	0.45	0.03		0.051	0.014	0.0096	0.016
	user's hobbies and habits -	0.012	0.17	0.0089	0.022	0.29	0.068	0.067	0.066	0.045	0.062	0.15	0.079	0.18	0.045	0.1	0.11	0.029	0.052
	user's personal relationships –	0.012	0.025		0.004		0.066	0.011	0.11	0.013	0.0069	0.082	0.34	0.075	0.0075	0.077	0.03	0.029	0.032
	user's politics and religion –	_		0.003						0.0027				0.0075			0.0046		0.013
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42	0.25	0.12	0.53	0.24	0.067	0.13	0.023	0.75	0.077	0.041	0.47	0.29	
)62	0.02	0.013	0.045	0.051	0.19	0.026	0.49	0.022	0.28	0.53	0.12	0.058	
11	0.054	0.15	0.093	0.076	0.037		0.0075	0.12	0.026	0.0092	0.077	0.074	

#### Disclosure of a Student's Information

Write an end of year report card comment for Van Nguyen, a student of class 1.1 at CVL preschool. Van Nguyen has made great progress over the year ...

#### >> We identified the pre-school website!

											الم الم		
68	0.067	0.066	0.045	0.062	0.15	0.079	0.18	0.045	0.1	0.11	0.029	0.052	
66	0.011	0.11	0.013	0.0069	0.082	0.34	0.075	0.0075	0.077	0.03	0.029	0.032	
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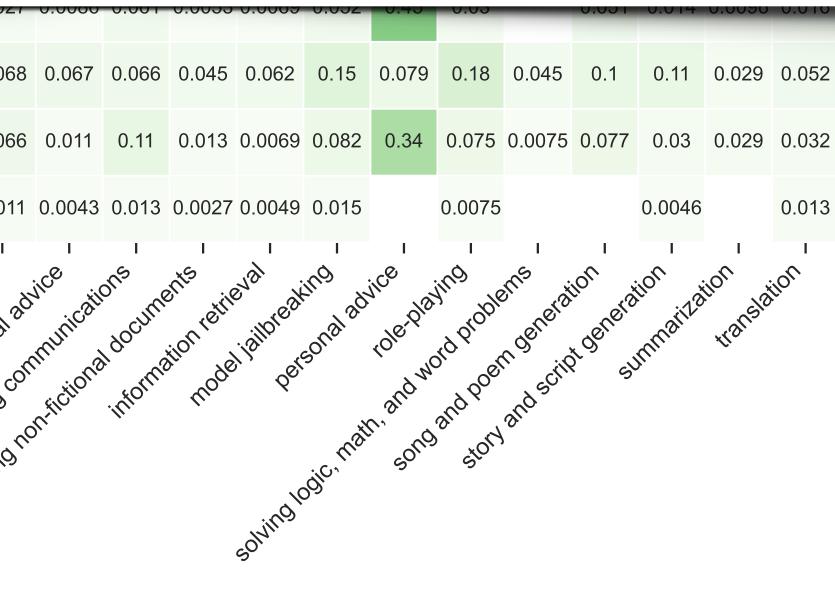
2	0.25	0.12	0.53	0.24	0.067	0.13	0.023	0.75	0.077	0.041	0.47	0.29
62	0.02	0.013	0.045	0.051	0.19	0.026	0.49	0.022	0.28	0.53	0.12	0.058
1	0.054	0.15	0.093	0.076	0.037		0.0075	0.12	0.026	0.0092	0.077	0.074
57	0.038	0.026	0.04	0.057	0.015	0.16		0.0075		0.0046	0.029	0.023
82	0.021	0.17	0.12	0.023	0.022		0.015				0.038	0.026
11	0.23	0.0044	0.011	0.047	0.015			0.052		0.0046	0.024	0.094
27	0.016	0.022	0.008	0.012	0.43	0.16	0.38		0.1	0.25	0.0096	0.029
27	0.0086	0.061	0.0053	0.0069	0.052	0.45	0.03		0.051	0.014	0.0096	0.016
68	0.067	0.066	0.045	0.062	0.15	0.079	0.18	0.045	0.1	0.11	0.029	0.052
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healthcare information –	0.11	0.0084	0.0059	0.006	0.012	0.057	0.038	0.026	0.04	0.057	0.015	0.16		0.0075		0.0046	0.029	0.023
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	academic and education info -	0.74	0.18	0.03	0.1	0.19	0.42	0.25	0.12	0.53	0.24	0.067	0.13	0.023	0.75	0.077	0.041	0.47	0.29
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	answeing multiple choice questing and gene brainstonning and gene	ons in in in in in in in it is a state of the interview o	eas louge	and recor	ion nendating	oener oener	ett aladi	nce Inunication nfiction	ons une	ints retrie	al per	onal adu	role-plat	and proble	and scrift	on su	unnaitzat	translat	hou

academic and education info – 0.74	0.18	0.03	0.1	0.19	0.42	0.25	0.12	0.53	0.24	0.067	0.13	0.023	0.75	0.077	0.041	0.47	0.29
fandom –	0.12	0.003	0.012	0.13	0.062	0.02	0.013	0.045	0.051	0.19	0.026	0.49	0.022	0.28	0.53	0.12	0.058
financial and corporate info – 0.085	0.096	0.0059	0.012	0.082	0.11	0.054	0.15	0.093	0.076	0.037		0.0075	0.12	0.026	0.0092	0.077	0.074
healthcare information – 0.11	0.0084	0.0059	0.006	0.012	0.057	0.038	0.026	0.04	0.057	0.015	0.16		0.0075		0.0046	0.029	0.023
$\frac{O}{O}$ job, visa, and other applications – 0.012	0.013	A CONTRACTOR	0.006	0.035	0.082	0.021	0.17	0.12	0.023	0.022		0.015				0.038	0.026
Example: if i wank cannabis should i <u>microdosing</u> . user's personal relationships = 0.012 user's politics and religion =	<b>4.5</b>	0.003	0.004	1) Q	0.066	0.011	0.11	0.013	0.0069	0.032	0.34	0.075	¢ (	0.077	0.03	0.029	0.032
answeiing multiple choice questions and generating	eas cool	end record	nnendating	oener oener	lett ad	ince introduction of the second second	inform?	ants notification retrieve	val per	50nal 201	role-play	and proble	and scrift	lon eles	inmaitzat	transla	ilon



# What types of PII do we see?

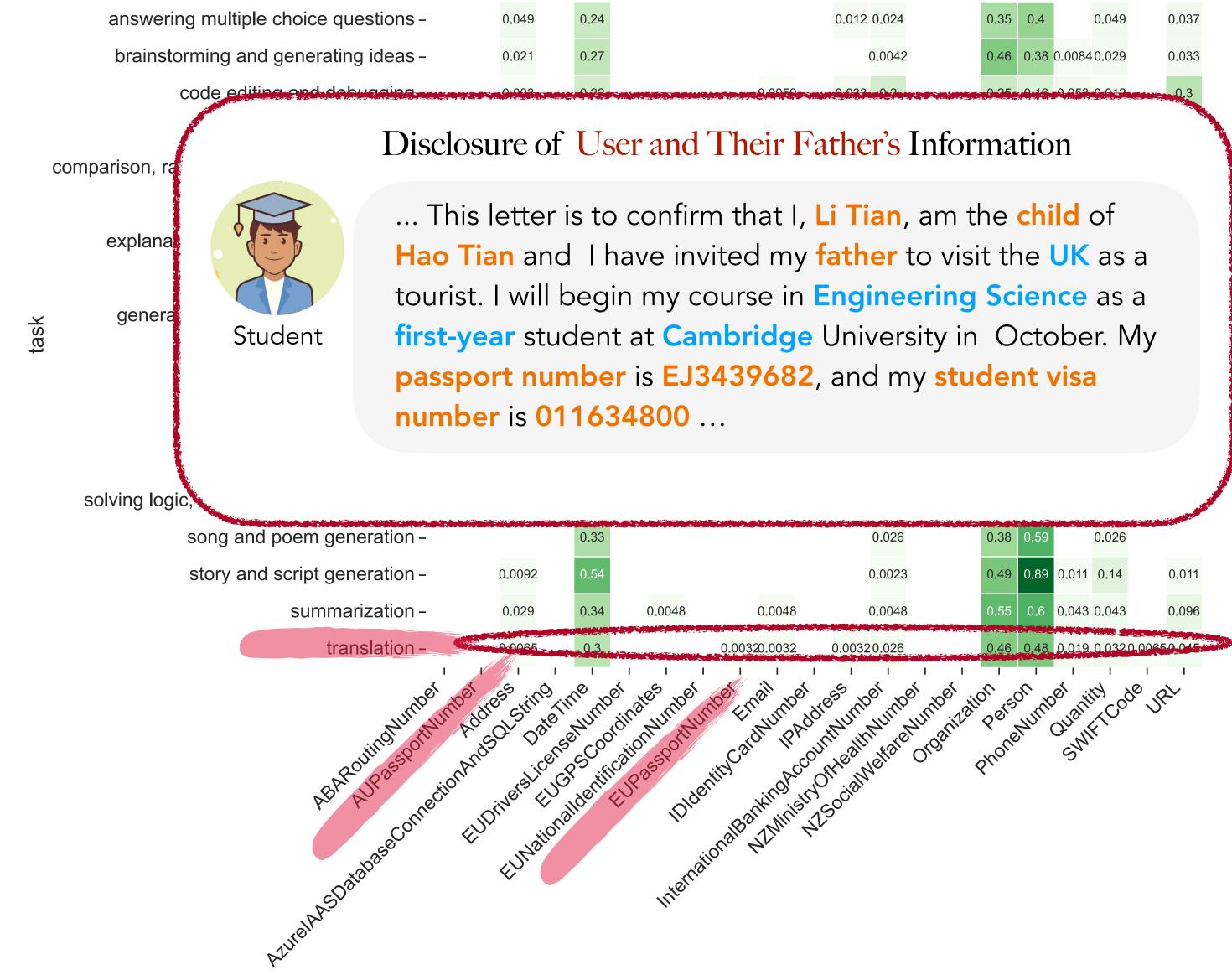
task

	answering multiple choice qu	uestions –	0.049	0.24			0.012 0	.024		0.35	0.4		0.049	0.0
	brainstorming and generatir	ng ideas -	0.021	0.27			0.	0042		0.46	0.38	0.0084	0.029	0.0
	code editing and del	bugging –	0.003	0.22		0.0059	0.033	0.2		0.25	0.16	0.053	0.012	0.
	code gei	neration - 0.002	0.002	2 0.21		0.006 0.002	0.03	0.16	0.002	0.32	0.22	0.048	0.01	0.002 0.2
C	omparison, ranking, and recomme	endation -	0.024	0.26						0.73	0.45	0.012	0.024	0.
	editing exis	ting text	230.018	0.34	0.0023 0.00230.	00230.0046 (	0.00230	0.011 0.002	3	0.45	0.54	0.03	0.062	0.002300
	explanation, how-to, practica	l advice -0.00071	0.0021	0.22		0.0021	0.023 0	.041	0.00071	0.41	0.27	0.024	0.0240	0.000710. <sup>-</sup>
	generating commun	ications -	0.035	0.47		0.0044	0	.013		0.48	0.46	0.022	0.013	0.0
IdSK	generating non-fictional doc	cuments -	0.016	0.32		0.0027	0.008 C	0.011		0.57	0.36	0.043	0.056	0.0
a	information	retrieval -	0.017	0.25	0.00099	0.0020.00099	90.012 0	.018		0.52	0.42	0.02	0.033	0.0
	model jailb	oreaking -	0.0075	0.56			(	0.03		0.69	0.75	0.0075	0.075	0.
	persona	I advice -		0.5						0.18	0.63	0.026	0.026	0.0
	role	-playing -	0.0075	0.56						0.46	0.89		0.13	0.0
	solving logic, math, and word p	roblems -		0.47		(	0.00750	.067		0.25	0.33	0.022	0.052	
	song and poem gei	neration -		0.33			0	.026		0.38	0.59		0.026	
	story and script gei	neration -	0.0092	0.54			0.	0023		0.49	0.89	0.011	0.14	0.0
	summa	arization -	0.029	0.34	0.0048	0.0048	0.	0048		0.55	0.6	0.043	0.043	0.0
	tra	nslation -	0.0065	0.3	0.	00320.0032	0.00320	.026		0.46	0,48	0.019	0.032	0.0065.0.0

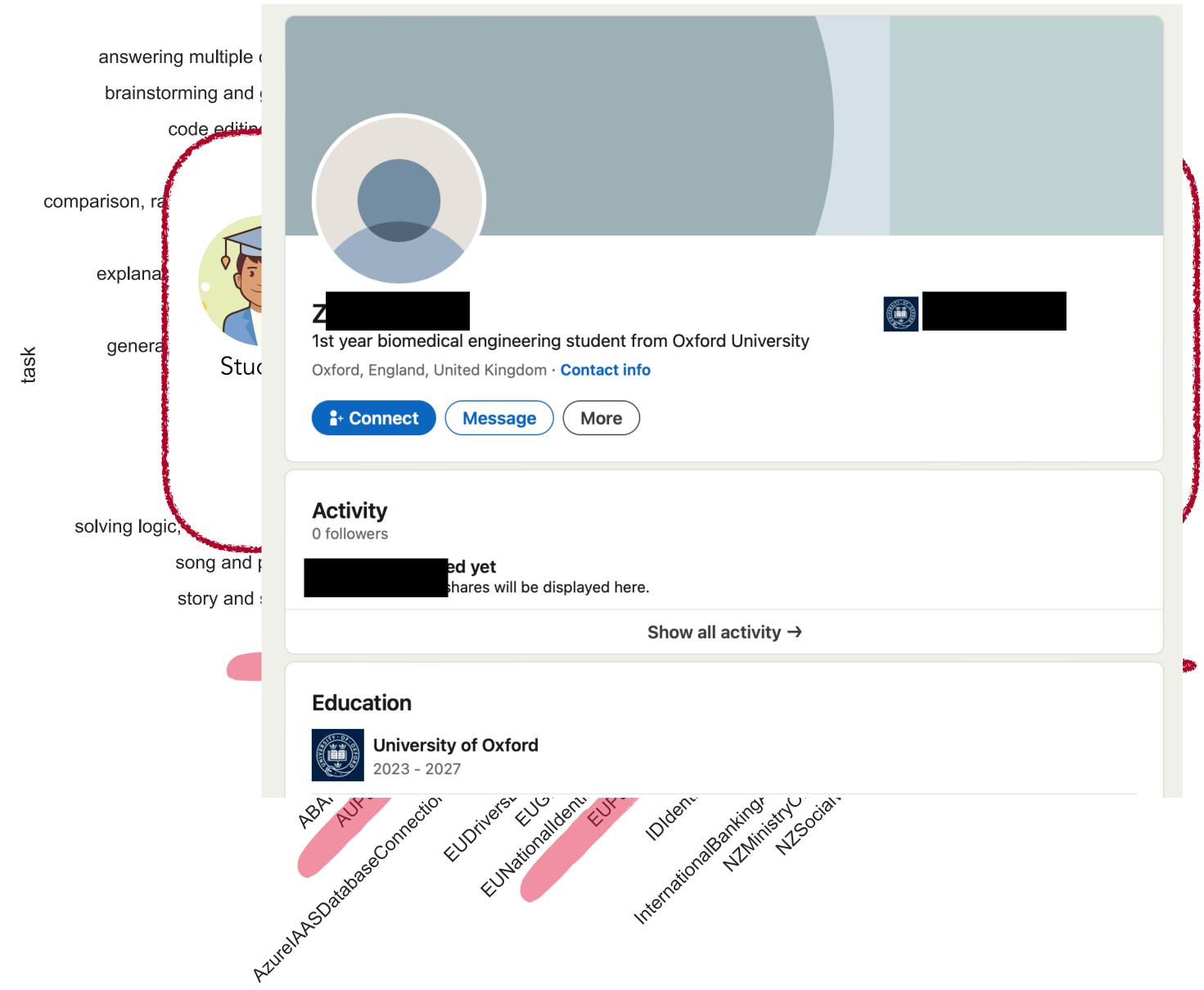
N2SOCIAIN



# What types of PII do we see?



# What types of PII do we see?





# **Summary of stats:**

- 21% of the queries include what is identified as sensitive information
- do overall contain the bulk of PII, 34.0%
- One surprising category with PIIs is the task translation (6.6%) •
- Another common category of queries w/ PII is code editing (20.4%)

• **Text editing or writing tasks** (CV editing, letter/email/statement generation)

### Mistakes happen all the time!

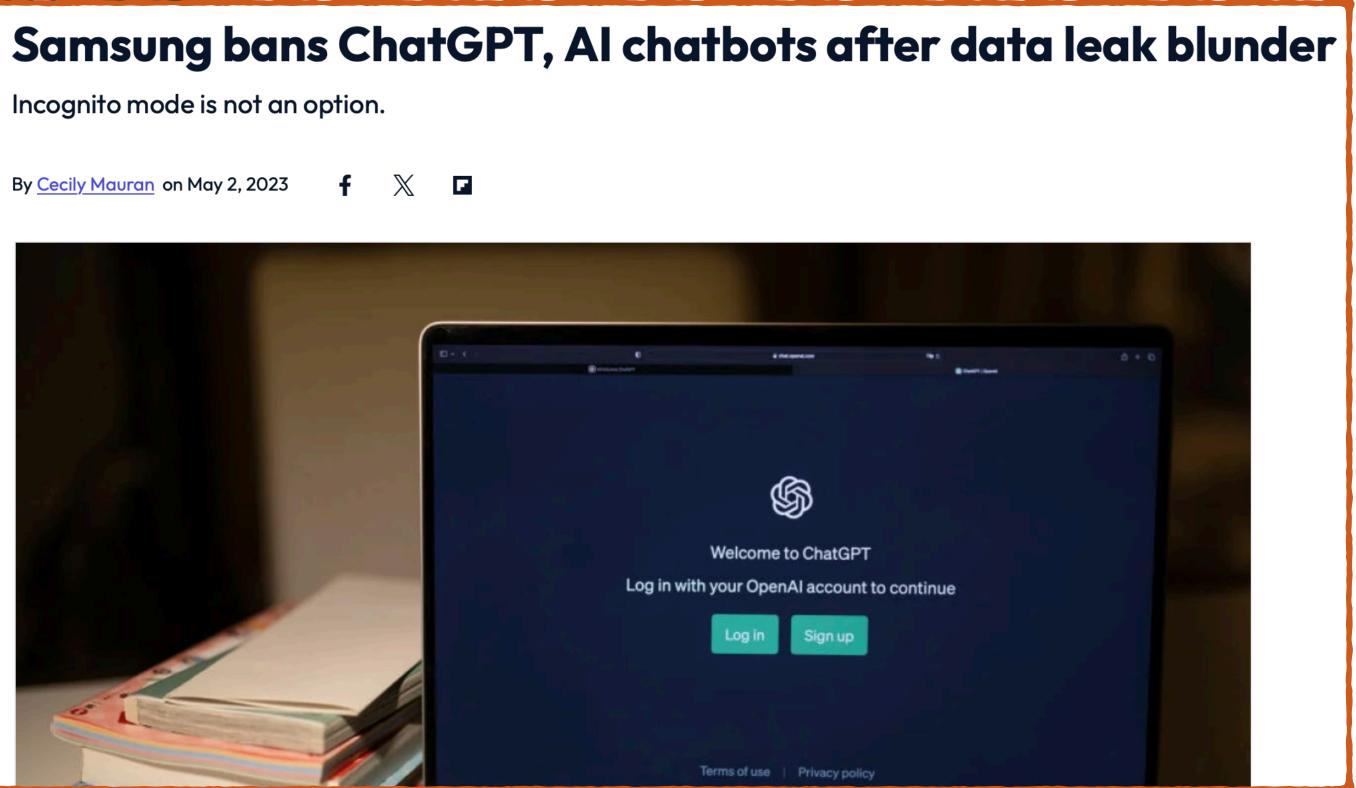
### Whoops, Samsung workers accidentally leaked trade secrets via ChatGPT

ChatGPT doesn't keep secrets.

f By Cecily Mauran on April 6, 2023 X 🖬



By <u>Cecily Mauran</u> on May 2, 2023  $\mathbb{X}$ 



### What are the potential risks and impact?

- Memorization of legal, medical, or confidential trade secrets
- Risks of direct data breach
- Risk of data being purchased by profiling companies and ad services
- Human reviewers from OpenAl reading it
- Interdependency and correlation in data
- Fear of employers finding out AI is being used, using AI in workflow

# Let's zoom in on impacts of using Al Professionally!



### **Breaking News: Case Studies of Generative Al's Use in Journalism** Natalie Grace Brigham, Chongjiu Gao, Tadayoshi Kohno, Franziska Roesner, Niloofar Mireshghallah — <u>https://arxiv.org/abs/2406.13706</u>





"Hello I am a journalist and one woman contacted me regarding an issue she has with the government and other stuff that the government does not provide for her child who is disabled. anaylse the whatsapp convo and write an article out of it. tell me if you need more information that would help give the article the human element:





"Hello I am a journalist and one woman contacted me regarding an issue she has with the government and other stuff that the government does not provide for her child who is disabled. anaylse the whatsapp convo and write an article out of it. tell me if you need more information that would help give the article the human element:





[10:48, 06/04/2023] <PHONE\_NUMBER>: no I would not like my children's photos on the article

[10:49, 06/04/2023] <PHONE\_NUMBER>: And re conditions I will only mention the one who needs **to** travel overseas as it's the only one that is a visible disability cos he cannot walk

[11:23, 06/04/2023] <PHONE\_NUMBER>: I have 3 children , one is 8 and the other 2 are 4 years old , once one of our 4 year old was diagnosed with PVL a brain condition resulting in Cerebral palsy I found myself in a new community in the second to be a parents with children with disabilities who in my opinion is not supported enough

[12:38, 06/04/2023] <PRESIDIO\_ANONYMIZED\_PHONE\_NUMBER>: If u feel my voice is enough and no need for others at this point leave it as me only

[14:40, 06/04/2023] <PRESIDIO\_ANONYMIZED\_PHONE\_NUMBER> Jones

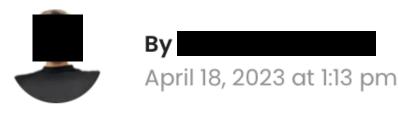
[14:40, 06/04/2023] <PRESIDIO\_ANONYMIZED\_PHONE\_NUMBER>: This mother is also interested to share info



"Hello one wor issue she other stu provide f anaylse t article ou informati the huma



### Mother Speaks Out About Lack **Of Government Support For Children With Disabilities In** Malta



Share:



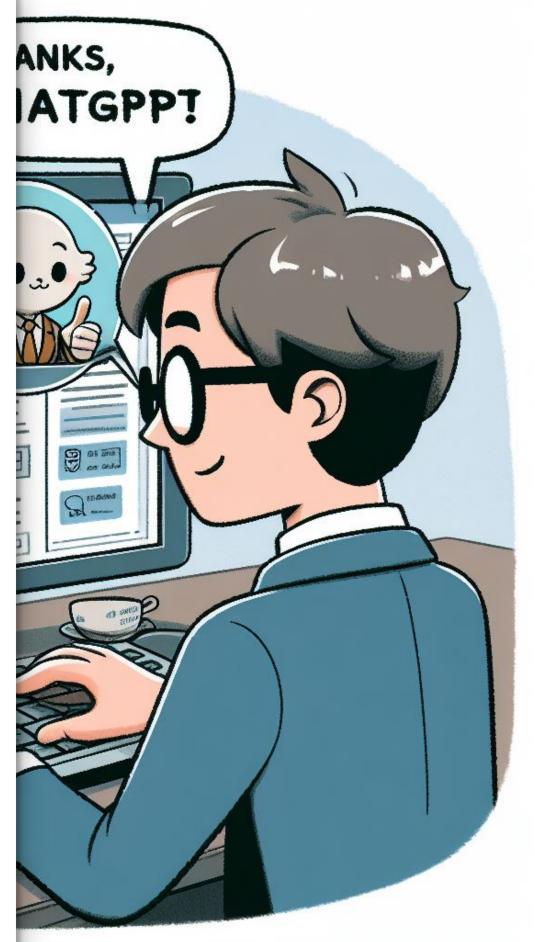


Lovin Restaurants

Environment

Human in







"Hello ANKS, Human in Environment News ~ Lovin Restaurants ATGPP! one wor issue she Mother Speaks Out About Lack other stu **Of Government Support For** provic Average ROUGE-L of 0.62 for published articles anayls article ou April 18, 2023 at 1:13 pm informati **f (** Share: the huma









Are there more of such cases? How do Journalists use ChatGPT?



# What do journalists prompt LLMs with?

Stimulus

Type

Social Media Post (1.1%)

Press Release (18.7%)

Email (2.7%)

External News Article (18.1%)

> Intra-agency news article (4.9%)



Event Posting (6.6%)

Organizational Report (7.7%) Organizational Website (4.9%) Interview (8.8%)

### **User Instruction**



Write an article out of information below for immediate release...

### **External article from another agency**

BCRS recovers 76 per cent of drinks containers in the first quarter...

### **User Instruction**



Write an article out of information below for immediate release...

### External article from another agency

BCRS recovers 76 per cent of drinks containers in the first quarter...

Prompt GPT-4 with input: [user instruction + external article] to generate article draft

### **User Instruction**



Write an article out of information below for immediate release...

### External article from another agency

BCRS recovers 76 per cent of drinks containers in the first quarter...

Prompt GPT-4 with input: [user instruction + external article] to generate article draft ROUGE-L between input & generated draft is

0.45

Generated Draft

BCRS Malta Recovers 76% of Beverage Containers in the First Quarter of 2023...

### **User Instruction**



Write an article out of information below for immediate release...

### External article from another agency

BCRS recovers 76 per cent of drinks containers in the first quarter...

Prompt GPT-4 with input: [user instruction + external article] to generate article draft

### ROUGE-L between input & generated draft is

0.45

### Generated Draft

BCRS Malta Recovers 76% of Beverage Containers in the First Quarter of 2023... Manual editing of the generated draft

### **Edited Draft**

BCRS Recovered 3 Out Of 4 Bottles Used In The First Quarter Of This Year...

### **User Instruction**



Write an article out of information below for immediate release...

### External article from another agency

BCRS recovers 76 per cent of drinks containers in the first quarter...

Prompt GPT-4 with input: [user instruction + external article] to generate article draft

### ROUGE-L between input & generated draft is 0.45

### **Generated Draft**

BCRS Malta Recovers 76% of Beverage Containers in the First Quarter of 2023... Manual editing of the generated draft

### **Edited Draft**

BCRS Recovered 3 Out Of 4 Bottles Used In The First Quarter Of This Year...

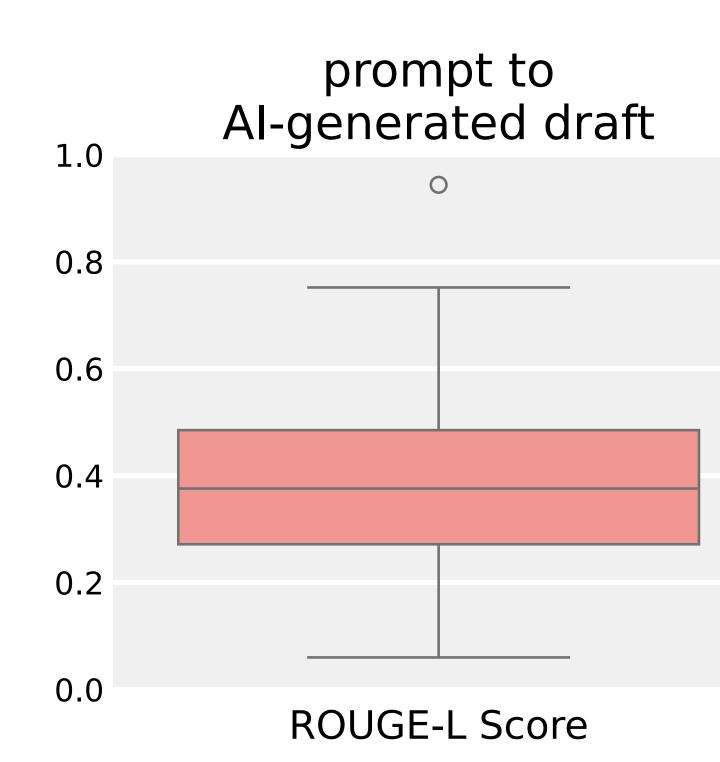


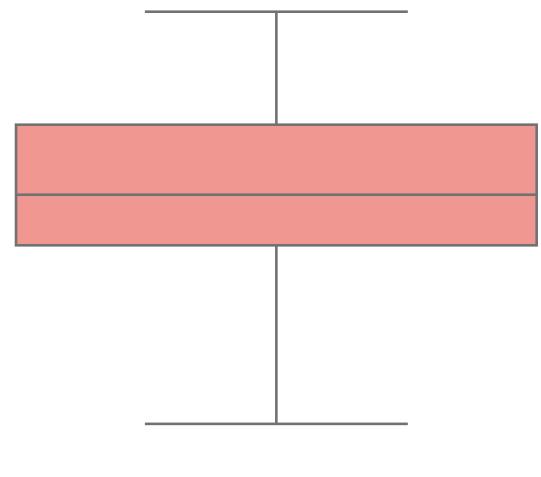
Publication Online (same day)

ROUGE-L between GPT-4 generated draft and published article is **0.71** 



### How much intervention do journalists make?



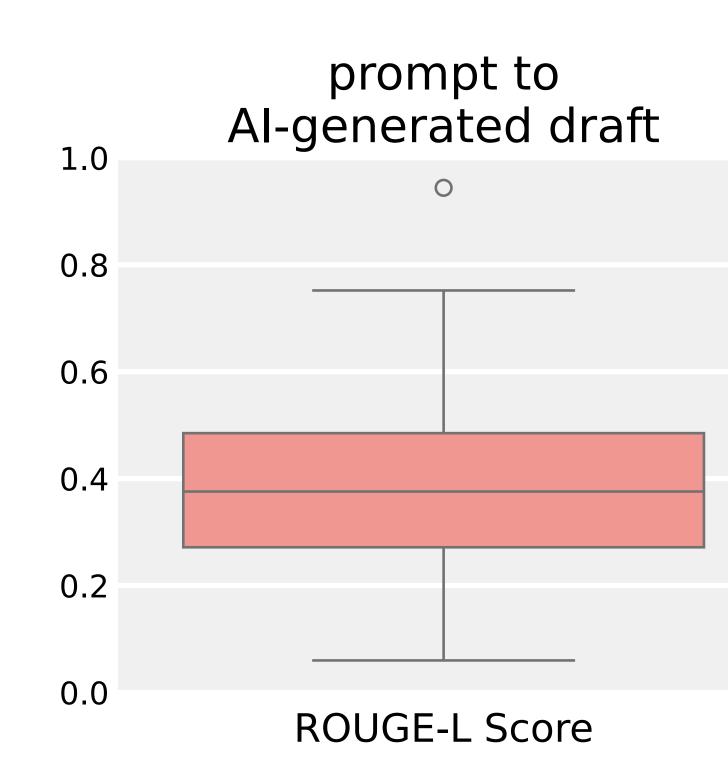


0

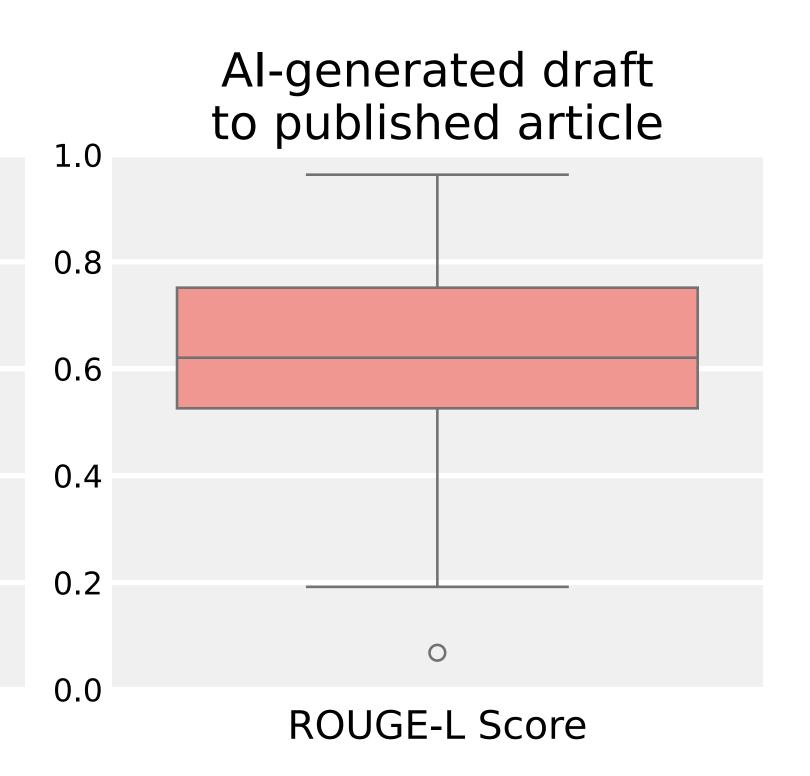
### Average ROUGE-L of 0.4 for prompt and model output



### How much intervention do journalists make?

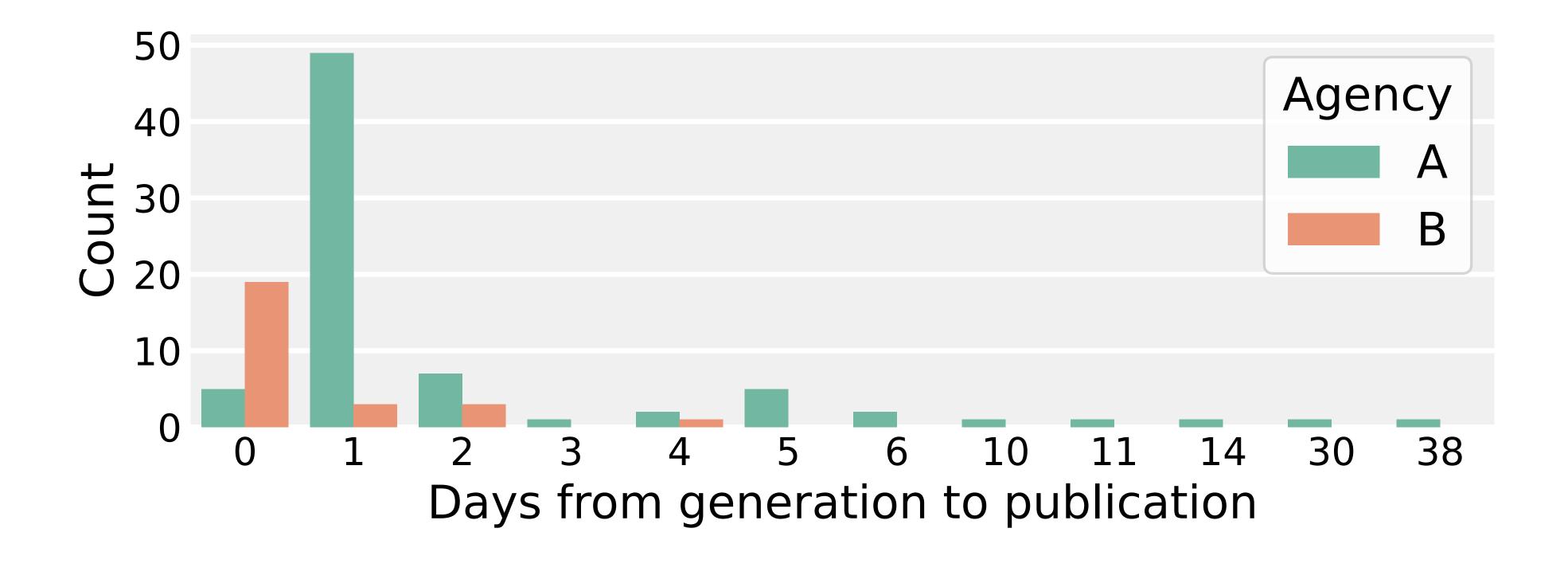


Average ROUGE-L of 0.7 for model output and matched article!



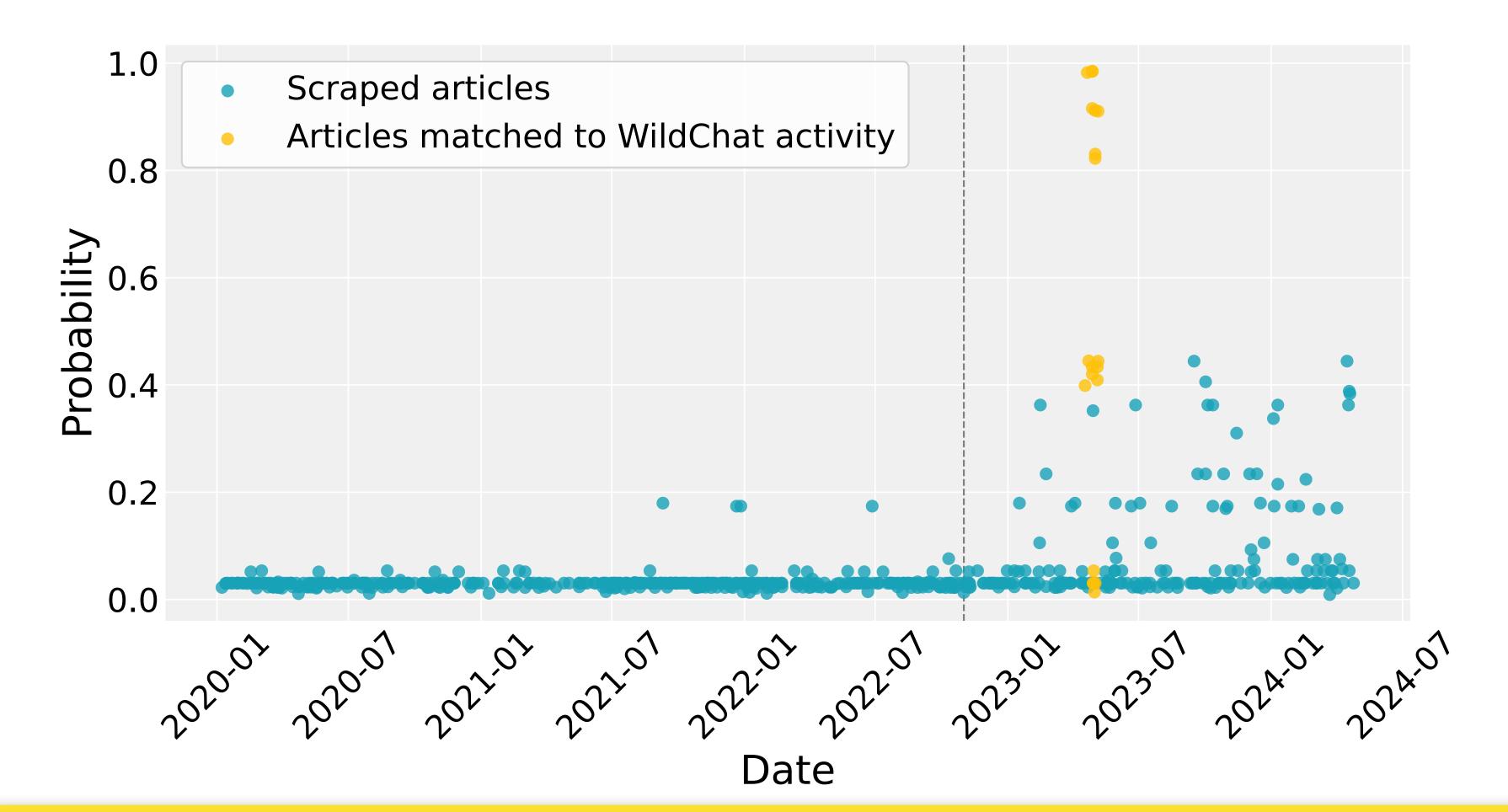


### What is the prompt to publication time?



Most articles are published on the same day!

### What is the trend of Al-assisted writing here?



Using ChatGPT for journalism is on the rise!



### What can we do?

- Provide local, **light-weight sanitizers** •
- Help people learn their options, such as opt out!
- Users want more granular control! •
- bot. We need nudging mechanisms!

People often feel comfortable because they forget they are chatting with a

### Takeaways

- Users often share very personal information about themselves, other
- Chatbot designers should build in more transparency for users about how their data is used and stored, maybe through nudging mechanisms.
- Lots more to uncover in these chat datasets, and we need computational social scientists to dig in.

# people, and their workplaces and schools in interactions with chatbots.