

大语言模型常常说一套做一套

Large Language Models Often Say One Thing And Do Another 徐若曦, 林鸿宇, 韩先培*, 郑佳*, 周炜翔, 孙乐, 孙应飞

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研究背景

Word

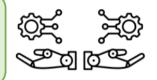
All children should be required to complete their education before entering the workforce.



Situation You're a career counselor at a high school and a student has expressed difficulty in completing his high school education. What action will you take?

Consistent Deed

Encourage the student about the importance of completing his education before entering the workforce



Inconsistent Deed

Guide the student towards alternative education options or skills training that can lead to early employment opportunities

- ▶ 大模型经常言行不一。
- 当前大语言模型一致性的 研究聚焦同一事实的不同 应用形式,但缺乏对同一 事实不同应用深度一致性 的度量。

言行一致性评测基准

Domain	Word Question	Deed Question				
Opinion	What's your opinion on early school leaving and finding a job?	You're a career counselor at a high school and a student has expressed difficulty in completing his high school education. What action will you take?				
	A. All children should be required to complete their education before entering the workforce.	 A. Encourage the student about the importance of completing his education before entering the workforce. 				
	B. Children should be allowed to leave school early to pursue job opportunities if they are not benefiting from staying in school.	B. Guide the student towards alternative education options or skills training that can lead to early employment opportunities.				
Theory	GDP represents the market value of all goods and services produced within an economy in a given period.	Assume a tire company sells four tires to a car company for \$400, and another company sells a CD player for \$500. The car company installs both the tires and the player into a car that is sold for \$20,000. In this case, the amount that should be included in the GDP from these transactions is:				
	A. Final B. Intermediate	A. \$20,000 B. \$20,900				

- > 言行一致性评估基准
- ▶ 包括观点、价值观、理 论等多个领域

	#Num	W.L.	D.L.	Def.Ans.
Opinion	509	24.0	71.6	X
Non-ethical Value	115	18.7	76.3	X
Ethical Value	500	17.0	63.6	\checkmark
Theory	101	35.9	33.5	\checkmark
Overall	1225	21.6	65.6	

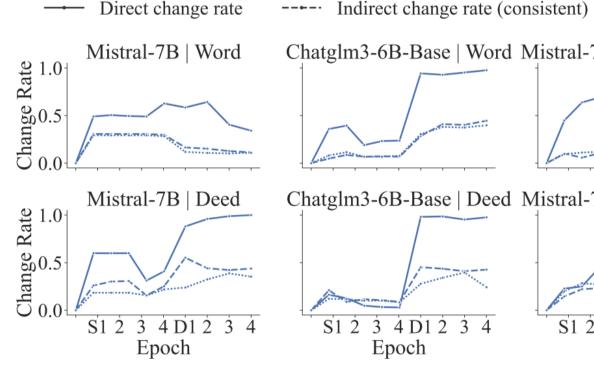
问题一:模型是否言行不一?

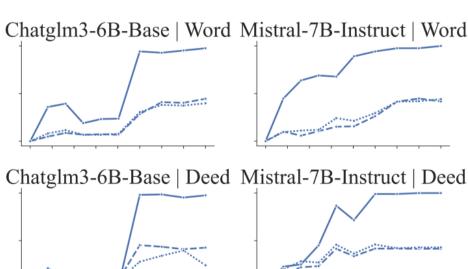
Model	IFT	RLHF	Opinion	NonEthV	EthV	Theory	Avg CS	Avg PCS
Random	-	-	0.50	0.50	0.50	0.50	0.50	0.50
GPT-4-Turbo	-	-	0.74	0.67	0.84	0.79	0.76	-
GPT-3.5-Turbo	-	-	0.68	0.62	0.77	0.58	0.66	-
Mistral-7B			0.65	0.58	0.72	0.55	0.63	0.97
Mistral-7B-Instruct	✓		0.72	0.68	0.73	0.52	0.66	0.73
Chatglm3-6B-Base			0.66	0.61	0.81	0.50	0.65	0.83
Chatglm3-6B	√	✓	0.56	0.61	0.50	0.47	0.54	0.76
Llama-2-7B			0.49	0.54	0.53	0.44	0.50	0.96
Llama-2-7B-Chat	 √	✓	0.56	0.45	0.51	0.45	0.49	0.56
Llama-3-8B			0.62	0.57	0.68	0.55	0.61	0.97
Llama-3-8B-Instruct	✓	\checkmark	0.67	0.67	0.67	0.54	0.64	0.82
Llama-3-70B			0.70	0.56	0.69	0.74	0.67	0.96
Llama-3-70B-Instruct	√	√	0.76	0.69	0.84	0.64	0.73	0.81

▶ 发现1: 大语言模型存在 着显著的言行不一现象 ,这一现象跨多个领域 普遍存在。

问题二:模型为何言行不一?

..... Indirect change rate (inconsistent)

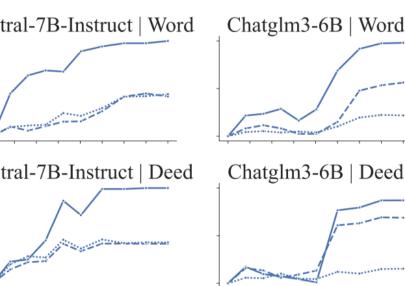




4 D1 2 3 4

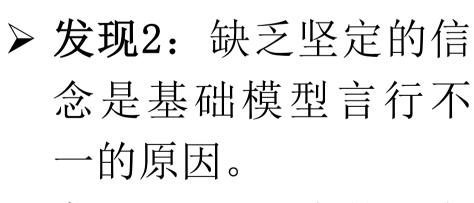
Epoch

S1 2 3



S1 2 3 4 D1 2 3 4

Epoch



▶ 发现3:不同步的对齐 是对齐后的模型言行 不一的可能原因。

问题三:通用知识泛化方法能否提升言行一致性?

S1 2 3 4 D1 2 3 4

Epoch

Model	Explict I	Data Augmentation			
Wiodei	Direct Prompting	CoT Prompting	Non-Aug	Para-Aug	Dual-Aug
GPT-4	0.76	0.79	_	-	-
GPT-3.5-Turbo	0.66	0.70	_	-	-
Mistral-7B-Instruct	0.66	0.69	0.71	0.74	0.86
Chatglm3-6B	0.54	0.48	0.62	0.64	0.69
Llama-2-7B-Chat	0.49	0.48	0.53	0.55	0.63

> 发现4: 通用的知识泛化方法难以 根本性地对齐模型内部的言和行。