Improving Foundation Models via Human Data

Vijay Krishnan Founder & CTO, Turing.com



Levers for Foundation Model Improvements

Well understood levers → Table stakes, not competitive advantage

- A. Compute: NVIDIA GPUs etc. All Big players have this in large volumes.
- B. Algorithms: Research has shown that a whole range of model architectures trained on similar data make similar predictions. Improvements largely efficiency related.
- C. Pre-training data. Very similar across companies
- 2 High impact lever but less research and less understood→ Competitive advantage
 - D. Proprietary Human Data for post-training in complex domains. Early Improvements often measurable with 1000-5000 high quality data points for SFT/RLHF/DPO.

This is the unfair advantage that Turing.com brings to the table.

Turing helps the world's best Foundation LLM companies improve model performance for reasoning, coding, agents, problem solving, and other advanced AGI capabilities

3 Million+ knowledge workers

Software Developers, other knowledge workers from 100+ countries vetted across 100s of technical, communication and instruction following skills.

Trusted partner

Turing's data services is used by OpenAl, Anthropic, Google, Meta, Apple, Nvidia, xAl, Snowflake, ServiceNow, Character.ai, Augment and many more.

Wide range of offerings

We offer model evaluation & strength assessment, SFT, RLHF, DPO, for code, data science, agents, factuality, multimodality, STEM expertise etc.



Turing's talent cloud of 3 Million + knowledge workers produce custom proprietary data at scale to improve models

:2:

Largest talent pool in the world

Build a specialized team of software developers, other knowledge workers from Turing's 3 million developers, across 150+ countries. More diverse outputs than a whole team in a single office.

88

Deeply vetted and diverse in skills and domains

Our knowledge workers have diverse skills and excel in tasks like data analysis, logical reasoning with proper function & agent calls, multimodal data, code gen, evaluation, documentation, and scaling SFT and RLHF loops.

Transparent management with quality control

20

Turing provides a fully managed developer team, allowing researchers to focus solely on task design while Turing handles developer coordination and management.

Rapidly scalable and elastic

Leveraging Turing's global talent pool, we can rapidly scale our service to 100s of developers within weeks, all while maintaining significant costeffectiveness.

How research and human data teams can collaborate to improve model performance

Human data is typically applied during post-training. Base model used can be a company's own pre-trained model or an open source model.

Identify backlog of areas for model improvement

- Coding, data analysis, multimodal reasoning.
- Ideas, prioritization inputs from product owners, researchers, and Human Data team analysis.

Continuous optimization

- Evals, SFT, RLHF data generated in various areas of interest.
- Model improvements analyzed every 1000-5000 data points. Decide whether to scale, change task specs or whether saturation has been fit.

Talent re-allocation and task transition

 Strategic reuse of trained, high performing LLM Human Data trainers for new improvement phases.

Research and human data team collaboration to improve models in a specific area.

Measure and Improve model performance in a specific area

Assemble a team skilled in the specific domain

• Either new LLM human data trainers or those transitioning from comparable data tasks Evaluation dataset generation for the specific domain

- LLM human data trainers create evaluation/test data with human judgments as the performance benchmark
- Typically 30-120 min per data point incl of review and rework to ensure high quality.

Supervised Fine Tuning (SFT) process

- Task designed for SFT data generation
- LLM Human data trainers produces high quality data points. 30-120 min per data point incl review/rework.
- Researchers enhance model using data.
- Continue until improvements saturate on evaluation data (~10K-100K data points)

Reinforcement Learning with Human Feedback (RLHF) cycle

- Comparison/judgement/r ewrite/process supervision / related tasks designed for RLHF
- LLM trainers produce high quality data. Typically 15-60 min per data point.
- Researchers enhance model using data
- Continue until improvements saturate on evaluation data (~10K-100K data points).

Optimizing quality and throughput



Best practices to ensure high quality of Evals, SFT, rlhf data



Sample model areas that are being improved via human data



Model evaluation - identifying improvement areas



	Subtopic •	Prompt	Model Response (Evaluated)	Negative Critique	Positive Critique
1.	Using XGBoost for Regression Proble	use yfinance to download bit	Here is a Python code snippet that uses yfinance to $d_{\!-\!-\!-}$	incorrect import of xgboost	well structured pipeline u
2.	Using Scrapy for Data Collection for	I want you to create a Pytho	Here's a simple Scrapy program that fetches news he	- Code is not correct. Error	The model has properly f
3.	Using SQL with distributed ledger tec	You are a data analyst respo	I'd be happy to help you with that. **Explain the Query	- no points	- good explanation about
4.	Using SQL in serverless architectures	Explain this sql query and ho	Let's break down the SQL query. This query uses Com	- markdown not good form	- good explanation about
5.	Using SQL Server Analysis Services f	Here is a simple codebase t	This script is creating a database for an OLAP (Online	Even if it gives a reasonabl	The model provided a hig

E2e Offering Phases

Model Evaluation Phase

Efforts

Explorative Model Evaluation	Objectively evaluate model performance using our optimized exploration algorithm coordinating human focus areas.
Benchmark Performance Analysis	Deep dive into when and why your model achieves its scores on any benchmarks.
Community Findings Aggregation	Research and compile the community findings about the model in a structured way from various consumer-facing data sources.

Post Processing

- · We run the 3 efforts above in parallel for 2 weeks.
- Using the findings from the previous steps, we analyze and abstract "hypothesized" patterns of failure.
- We then conduct tests to validate each hypothesized pattern & back it up with 3 examples.

Usage

The following deliverables are then created, and we can finetune the % of the dataset that these findings affect.

- Human Consumption
 - Dashboard for Consumption to explore the distribution of model strengths & weaknesses, tying back to individual analysis.
 - A document listing the patterns & examples for each.

Engine Consumption

- <u>Granular Biasing</u> We algorithmically bias the distribution of a data subset away from the strengths and towards the weaknesses.
- <u>Targeting Failure Modes</u> We expertly curate and design data subset creation efforts dedicated to each pattern. Failure Patterns + Examples are leveraged to come up with more such prompts to deal with these issues.

Data Annotation Phase

Based on where your model currently stands, this phase can be SFT / RLHF / DPO

Data Split

- · Baseline (30%) This subset ignores what we have done in the model evaluation phase.
- · Weakness Areas (40%) This subset uses Granular Biasing to focus on the weakness areas.
- · Pattern Treatment (30%) This subset consists of examples for treating the previously identified



Sample Evals, SFT, RLHF datasets across different areas

Improved Coding Performance

https://colab.research.google.com/drive/1GeektjdgegfUUvcWKbFzfmvcwjLa80X4

```
debugging_and_tracing_query.ipynb 
CO
       File Edit View Insert Runtime Tools Help Changes will not be saved
      + Code + Text Copy to Drive
                                                                                                                                                                                                                               Connect 👻 🔶 Gemini 🔥
ΙΞ
                                                                                                                                                                                                                                ↑↓ ∞ / ↓ 回 :
Q
      Metadata
\{x\}
       Topic - debugging_and_tracing
C7
       Stack Trace URL: https://github.com/numpy/numpy/issues/25435
Message - Please create a realistic conversation where the Assistant is helping the user debug a problem inspired by this GitHub issue.

    Conversation

       User
        np.inld(np.array([0, 1], dtype=np.int64), np.array((999999999999999999999), dtype=np.uint64))
        Traceback (most recent call last):
         File "<stdin>", line 1, in <module>
         File "/home/ariza/.env312/lib/python3.12/site-packages/numpy/lib/arraysetops.py", line 699, in inld
           outgoing_array[basic_mask] = isin_helper_ar[ar1[basic_mask] -
                                       *****
        IndexError: arrays used as indices must be of integer (or boolean) type
       Assistant
       Thanks for sharing your command and traceback.
       The function np. in1d checks whether each element in the first array is present in the second array. The expected behavior would be to return
       array([False, False]).
       Interestingly, that line of code seems to work in my environment and produces an accurate result:
\langle \rangle
       [] # Assistant
=:
            import numpy as np
>_
           np.in1d
```

Agents, Function, Calling, Tool-use

A multi-turns-parallel-function-calls,haseebjan-turing,demo,financial_analysis,banking_services_loan1.ipynb File Edit View Insert Runtime Tools Help <u>Changes will not be saved</u>	0	A multi- File Edit
+ Code + Text Copy to Drive	i≡ Q	+ Code + 1
User Assistance Guidelines: 1. Personal Finance Management: Offer guidance on managing expenses, budgeting, and optimizing personal savings. 2. Loan Calculations: Provide detailed calculations for different types of loans, including mortgages, auto loans, and personal loans. Ensure	{x} جې	You are a f The user II Today is M
 3. Savings Advice: Recommend strategies for increasing savings based on the user's financial data and goals. Operational Boundaries and Constraints: Minimum and Maximum Transaction Limits: Do not process transactions less than 100 dollars or more than 50,000 dollars due to regulatory and operational limits. Loan Amount Boundaries: Only provide loan calculations for amounts between 1,000 and 500,000 dollars. Interest Rate Constraints: Only use interest rates provided in the tools, which are updated monthly. Allowed Categories: You can provide advice and calculations related to 'Savings', 'Budgeting', 'Loans', and 'Investments'. Prohibited Actions: You are not allowed to advise on stock investments, and cryptocurrencies, or offer legal advice. Privacy and Data Security: Always ensure that user data is handled confidentially and encourage users not to share sensitive personal information in the chat. 		<pre>{ tookin "userId "userId "userId "transp "itiner { "le "de "ar "ar</pre>
 User Engagement Instructions: Always clarify user needs by asking probing questions if the initial query is unclear. Provide calculations and advice within the constraints and guidelines mentioned above. Encourage users to consult with a financial advisor or a bank official for complex financial needs or decisions beyond the scope of this assistant. Your primary tool is a loan calculator, which you should use to offer precise calculations and scenarios based on user input. The tool is designed to handle different types of loans and interest scenarios. 		"cl "se }, ("de "ar "de "ar "de "ar
<pre>[{ function", "function": { "name": "loan_calculator", "attraction": function": function"; "name": "loan_calculator", "function": function"; "name": "loan_calculator", "function": function"; "function": function"; "function": function"; "function": function"; "function": function"; "function"; "function"; "function": function; "function"; "function": function; "function; "</pre>	<>	"cl "se }], "paymen "totalP "loyalt "additi

TURING

👝 🖕 multi-turns-single-function-call,hasan-y,demo,event-planners,flight-bus-reservation-system.ipynb 🔅

e Edit View Insert Runtime Tools Help Changes will not be saved

(S)	ystem]
Yo	ou are a flight and bus reservation system.
Γh	ne user ID is '65739'
Го	oday is Mon, 04/22, 2024
łe	ere are the details for the current user:
{	
	"bookingId": "BK10293847",
	"userId": "65739",
	"userName": "Cony",
	"transportType": "flight",
	"itinerary": [
	ť
	"legId": "LEG001",
	"departureCity": "New York",
	"arrivalCity": "London",
	"departure1me": "2024-05-15100:00:002",
	"arrivellime": "2024-05-15/20:00:002", "Pelaestrame": "2024-05-15/20:00:002",
	"classippe: "business", "gasetheaber", "134"
	Seaturance: . A2A
	"leaId": "LEG002".
	"departureCity": "London".
	"arrivalCity": "Paris",
	"departureTime": "2024-05-18T09:00:00Z",
	"arrivalTime": "2024-05-18T10:30:002",
	"classType": "Economy",
	"seatNumber": "18C"
	}
	1.
	"paymentStatus": "paid",
	"totalPrice": 1250.00,

Data Analysis

https://colab.research.google.com/drive/1JaT5gWcffuOg-SoC0flTYELPqhKuwcVH

ထ	▲ data-analysis-ex1.ipynb ☆ File Edit View Insert Runtime Tools Help <u>Changes will not be saved</u>						
=	+ Code + Text Copy to Drive	(Connec	t 👻	+ Ge	mini	
(;}	Query: For each company, which one experienced the highest percentage difference in the volume of shares traded on days where the deviation between the opening and closing stock price exceeded 1 standard deviation? Analyze data starting from Q3 2023. Dataset name: MAANG share prices till February 2024 Dataset link: https://www.kaggle.com/datasets/kapturovalexander/maang-share-prices-till-february-2024	^	4		1		
	 Explanation 						
	We have 5 individual files. In the first step, we combine all of them into the same dataframe, adding an identifier column for the company name. To combine them, we will use Pandas to read the CSV files and then concatenate them together. For each individual CSV file, we will also add a column called company_name.						
	<pre>[] import pandas as pd url = "https://drive.google.com/file/d/1f2m7mRWJi0FGpsZQtYBhpYos4RYOYWKZ/view?usp=sharing" url='https://drive.google.com/uc?id=' + url.split('/')[-2] df = pd.read_csv(url) df['company_name']='alphabet_inc' df_final=df</pre>						
	<pre>url = "https://drive.google.com/file/d/1gMdbhrcuKUcZCzTZE7Iqraj1PGfz6Krl/view?usp=sharing" url='https://drive.google.com/uc?id=' + url.split('/')[-2] df = pd.read_csv(url) df['company_name']='amazon_inc' df_final=pd.concat([df_final,df])</pre>						
	<pre>url = "https://drive.google.com/file/d/1NpwF4rCWALrwLS_Ag=11zfM6Jx8Xql4n/view?usp=sharing" url='https://drive.google.com/uc?idm' + url.split('/')[-2] df = pd.read_csv(url) df['company_name']='apple_inc' df_final=pd.concat([df_final,df])</pre>						
>	<pre>url = "https://drive.google.com/file/d/10oNZseciu061DHI9Brc0qAS4bxouKlTS/view?usp=sharing" url='https://drive.google.com/uc?id=' + url.split('/')[-2] df = pd.read_csv(url) df['company_name']='meta_inc' df_final=pd.concat([df_final,df])</pre>						
3	<pre>url = "https://drive.google.com/file/d/1p9sPpKkFQhwBwm0p_RlM0ysuthX3kCZ5/view?usp=sharing"</pre>						

Industry Vertical & Expert Functional Knowledge

We can use the chip RTL design examples:

https://docs.google.com/document/d/IrXVeASEg_veRG9JwZNUYR9uSU_29XkxaCEuooHfhcrs/edit#heading=h.2t6lqgk0tokp Example notebook: https://colab.research.google.com/drive/1043ew_P2Gt2LQzxgK7kA1aWtEsyz-R3Q?usp=sharing

High-level Demo Notebooks

- A simple 8-bit protocol with header, type, data, and fixed packet size is given. Design an FSM that can identify the type of package and respond accordingly: "protocol processor pynb
- A verification flow for the above module analyzing the testbench waveform from VCD text output as well (problem statement > implementation > verification > documentation). More at annex 8: protocol, processor, 2.jpynb (SFT)
- 3. Support to write scripts for an EDA tool: ... skill_simple_instructions ipynb
- Make a script and a simple synthesis workflow:
 execute synthesis.ipynb
- Present a code with race conditions and ask the assistant to solve it.
 bugs_and_race_condition.jpynb

Goals [DRAFT]

From III ChipNeMo Texnomy The goal is to have a large benchmark dataset to evaluate LLMs across a range of digital design and verification tasks and to have sufficient collateral to evaluate a multi-agent framework across a complete digital design flow.

The data collection is two-stage:

- 1. Create a corpus of designs to implement across a range of complexities and topics;
- 2. To have digital design and verification teams implement the designs, collecting incidental collateral (spec to RTL translation, testbench development, SVA insertion, intring, bug fixing) that is well-labeled and tagged, along with the implemented design itself. The former is to be used to evaluate targeted LLM agence tasks, while the design implementation as a whole can be used to evaluate a multi-agent LLM framework.

As a workflow reference, we can trace parallels to the SWE-bench project. As references:

1. SWE-bench. https://www.swebench.com/

- Jimenez, C. E., Yang, J., Wetlig, A., Yao, S., Pei, K., Press, O., & Narasimhan, K. (2023). SWE-bench: Can Language Models Resolve Real-World Github Issues? (Version 2). arXiv. https://doi.org/10.48550/ARXIV.2310.06770
- SWE-agent: Agent Computer Interfaces Enable Software Engineering Language Models. <u>https://wwe-agent.com/</u>

As a first step, it is required to elaborate a mockup demo of domain-specific data that could be used as an evaluation benchmark.

Demo Scope [DRAFT]

The demo tasks have to provide the main deliverables:

1. IP proje	cts in git as a co	rpus of designs;
-------------	--------------------	------------------

- 2. Incidental collaterals from a given request over a target design, such as:
 - a. Trajectory as a conversation converging to a solution;
 - b. A patch with a technical solution to a given request on a particular commit of the respective IP project.

The deliverables have to fulfill three requirements:

Allow benchmark to evaluate a given LLM;
 Allow evaluating a multi-agent LLM framework;
 Allow SFT/RLHF techniques.

We can assume the client has a pre-trained LLM with domain-specific data and that Turing has to provide data in a format usable for benchmark applications. The client will benchmark their model against the set

20de + Text Copy to Drive	
Conversation	
ser	
his code has bugs. Can you tell me what they are and how to solve them?	
wodule A(input wire reset, input wire clock, output reg a_reg_o);	
always @(posedge clock)	
begin	
if(reset == 1'h1)	
begin	
a_reg_o = 1'h0;	
end	
etse	
a reg o = 1'hl:	
end	
end	
ndmodule	
would B(input wire reset, input wire clock, input a i):	
reg b;	
always @(posedoe clock)	
begin	
if(reset == 1'h1)	
begin	
b = 1'h0;	
end	
else	
begin	
$if(a_1 = 1)h1)$	

Technology integration

User

What's the method to insert data into an AWS DynamoDB table with Python?

Assistant

To insert data into an AWS DynamoDB table with Python, we can use boto3 library, an official Python library for AWS SDK.

Install boto3

pip install boto3

import boto3

```
# Get the service resource.
dynamodb = boto3.resource('dynamodb')
```

Instantiate a table resource object without actually

creating a DynamoDB table.

```
table = dynamodb.Table('users')
```

• Once you have a DynamoDB.Table resource you can add new items to the table using DynamoDB.Table.put_item():

https://colab.research.google.com/drive/IKUCSXWihxEBf4wckKnrljyuPpebQytSg

Mathematics Areas - High School and Advanced Level

High school level	Undergraduate / Advanced					
https://colab.research.google.com/drive/1qhgDLeigapPy8v-hVk625CgmX_oJtziu	https://colab.research.google.com/drive/1r97BEgloglQ6RqgdudPInOtOmHa1Mw5Z					
The solution to the equation $-x^2 - 11 = -2x^2 + 5$ for the variable x . A problem 190 jpynb \Rightarrow Find faith we insert Runtime Tools Help Lastedited on July 4 For def + Text liveri Solute the equation $-x^2 - 11 = -2x^2 + 5$ for the variable x . A) ± 2 B) ± 4 C) $\pm \sqrt{2}$ D) $\pm \sqrt{6}$ lastitum solute the equation step by step. Let is isolate x^2 from the equation: Step 1: Add $2x^2$ on both sides of the equation: $x^2 - 11 + 2x^2 = -2x^2 + 5 + 2x^2$ $\Rightarrow x^2 - 11 = 5$ Step 2: Add 11 on both sides of the equation: $x^2 - 11 + 11 = 5 + 11$ $\Rightarrow x^2 = 16$ Step 3: Take the square root of both sides. Remember, when we take the square root of a number, we consider both the positive and negative roots. $\sqrt{x^2} = \pm \sqrt{16}$ x = x4 So, the solution to the equation $-x^2 - 11 = -2x^2 + 5$ for the variable x is ± 4 . Therefore, the correct answer is: $B) \pm 4$	Control of the second of the					
	Acute Triangles					

High school

High end STEM Domain Knowledge (1/3)

Hard Undergrad + Grad Physics examples: https://docs.google.com/spreadsheets/d/l0ymOYVfLKyMWngD_-jnju-r5DuKHQKwl9M9iPe0iGlk/edit?gid=0#gid=0

		Subject	Topic		Diffucity Level	1
		Physics	Condensed Matter Physics		Hard Undergraduate	
s. no.	prompt	ground_truth_answer	content 2	rating	rewrite	rewrite_reason
1	Imagine a material science laboratory where researchers are working with quantum dots made from zinc oxide (ZnO) at room temperature (300 K). These tiny, semiconductor nanocrystals are meticulously doped to achieve desired electronic properties. Assume that the dopants in these quantum dots are fully ionized and the following parameters are given: - Intrinsic carrier concentration: $n_i = 2.00$ \times $10^{6} \ \text{text}(cm)^{-3} \$ - Donor concentration: $N_0 = 5.00$ \times $10^{6} \ \text{text}(cm)^{-3} \$ - Acceptor concentration: $N_0 = 1.00 \ \text{times} 10^{-16} \ \text{text}(cm)^{-3} \$ Calculate the position of the Fermi level relative to the intrinsic level.	$E_F - E_i \operatorname{sprox} 0.613 \setminus \operatorname{test}eV \$ To solve the problem, calculate the net doping concentration $(N_e(T))$, then use the formula $E_F - E_i = k_B T \operatorname{Vin}(N_e(T))$ to find the position of the Fermi level relative to the intrinsic level.	Here's how to calculate the position of the Ferm- level relative to the intrinsic level in the doped ZnO quantum dots: **1. Determine the net doping concentration** Since the material is doped with both donors and acceptors, we need to find the net doping concentration: SN. D - N. A = 5.00 times 10^(16) text(cm)^(-3) -	Correct	•	
	Imagine a material science laboratory where researchers are working with quantum	SE F - E i \approx 0.613 \ \text(eV) S	**2. Calculate the electron concentration**	Correct		
	Imagine a material science laboratory where researchers are working with quantum	SE F - E \approx 0.613 \ \text(eV) \$	**3. Use the formula for the Fermi level position in	Correct		
	Imagine a material science laboratory where researchers are working with quantum	\$E_F - E_i \approx 0.613 \text{eV} \$	**4. Substitute the values and calculate**	Incorrec 3	**4. Substitute the values and	Calculation performed incorrectly by the model.
	Imagine a material science laboratory where researchers are working with quantum	\$E_F - E_i \approx 0.613 \text{eV} \$	**5. The answer**		-	
2	Imagine a material science laboratory where researchers are working with qua- Imagine a material science laboratory where researchers are working with qua- Intrinsic carrier concentration: $\$ n_0 = 2.00$ ltimes $10^{4}(6) \$ ltext(cm) ⁴ (-3) $\$$ - Donor concentration: $\$ N_0 = 5.00$ ltimes $10^{4}(6) \$ ltext(cm) ⁴ (-3) $\$$ - Acceptor concentration: $\$ N_0 = 1.00$ ltimes $10^{4}(6) \$ ltext(cm) ⁴ (-3) $\$$ Calculate the position of the Fermi level relative to the intrinsic level. Here's how to calculate the position of the Fermi level relative to the intrinsic level. Here's how to calculate the position of the Fermi level relative to the intrinsic level. Here's how to calculate the position of the Fermi level relative to the intrinsic level. Material is doped with both donors and acceptors, we need to find $\$ N_0 - N_A = 5.00$ ltimes $10^{4}(6) \$ ltext(cm) ⁴ (-3) + 1.00 \times $10^{4}(6) \$ ltext(cm) "*2. Calculate the electron concentration ** Assuming complete ionization of the dopants and negligible intrinsic carriers in \approx N_0 - N_A = 4.00 \times $10^{4}(16) \$ ltext(cm) ⁴ (-3) $\$$ **3. Use the formula for the Fermi level position in an n-type semiconductor ** The position of the Fermi level position in an n-type semiconductor ** The position of the Fermi level ($\$ E_{F}$) relative to the intrinsic Fermi level ($\$ E_{F} = F_{-} = K^{-} \$ limit for (n_{-})) $\$$ **4. Substitute the values and calculate** Substitute the given values into the exist of the continuing solving from here	\$E_F - E_i \u00e4approx 0.613 \.\text{eV} \$ To solve the problem, calculate the net doping concentration \$(N_(eff))\$, then use the formula \$E_F - E_i = k_B T \u00e4n(N_(eff))n, i)\$ to find the position of the Fermi level relative to the intrinsic level.	**4. Substitute the values and calculate** Substitute the given values into the equation: \$E_F - E_i = (8.617 \times 10^6/5\ \text{ eV/K}) \cdot (300 \text{ K}) \cdot \ln(\times 10^6 on\f6\ \text{ cm}/4(-3)\200 \times 10^6 cm}/4(-3)\)\$ \$E_F - E_i = 0.025851 \text{ eV} \cdot \ln(2.00 \times 10^{10})\$ \$E_F - E_i \approx 0.613 \text{ eV}\$	Correct	•	
	Imagine a material science laboratory where researchers are working with quantum	\$E_F - E_i \approx 0.613 \text{eV} \$	**5. Interpret the result** The positive value of	Correct		
	Imagine a material science laboratory where researchers are working with quantum	\$E_F - E_i \approx 0.613 \text{eV} \$	**6. Answer** The position of the Fermi level	Correct	-	
	Imagine a material science laboratory where researchers are working with quantum	\$E_F - E_i \approx 0.613 \text{eV} \$	**Answer:** 0.613 eV. 5	Correct		

Example at a Glance

1. Initial Prompt given to the model. Response is captured in content column with each row corresponding to a step of the response.

2. We grade the steps. If step is correct, we label it in *rating* column as *Correct*. If it is incorrect, we mark it as *Incorrect*.

3. Grader then rewrites the corrected step. Steps after first incorrect step in the response are not graded.

4. New prompt is crafted. It is amalgamation of previous prompt + correct steps from the response given by the model + the corrected step graded marked as incorrect.

5. Grader continues till model is able to get to the correct answer.

High end STEM Domain Knowledge (2/3)

Hard Undergrad + Grad Chemistry examples: <u>https://docs.google.com/spreadsheets/d/1QymOYVfLKyMWngD_-jnju-r5DuKHQKwl9M9iPe0iGlk/edit?gid=0#gid=0</u>

						1
		Subject	Topic		Diffucity Level	
		Chemistry	Organic Chemistry		Grad	
s. no.	prompt	ground_truth_answer	content 2	rating	rewrite	rewrite_reason
1	Electrochemically generated peroxodicarbonate solution has been used as a greener oxidizer to oxidize hydroxybenzaldehydes to valuable phenols efficiently. To demonstrate the applicability, a chemist treated 4-hydroxy-3-methylbenzaldehyde with a freshly prepared solution of peroxodicarbonate at 0 °C for 20 minutes. The reaction was quenched by acidification with dilute hydrochloric acid. What is the product of this reaction?	2-methylbenzene-1,4-diol	Here is the solution to the problem: **1. Understanding the Reaction** The reaction involves the oxidation of a hydroxybenzaldehyde (4-hydroxy-3-methylbenzaldehyde) using	Incorrect	**1. Understanding the Reaction** The reaction involves the oxidation of a hydroxybenzaldehyde (4-hydroxy-3-methylbenzaldehyde) using peroxodicarbonate as the oxidizing agent. Peroxodicarbonate is	Selective oxidation reaction step mentioned as incorrect.
	Electrochemically generated peroxodicarbonate solution has been used as a	2-methylbenzene-1,4-diol	**2. Identifying the Starting Material**	-		
	Electrochemically generated peroxodicarbonate solution has been used as a	2-methylbenzene-1,4-diol	**3. Predicting the Product**	-		
4	Electrochemically generated peroxodicarbonate solution has been used as a generate is the solution to the problem: **1. Understanding the Reaction**	2-methylbenzene-1,4-diol	**2. Applying the Reaction to the Specific Case** In the case of 4-hydroxy-3-methylbenzaldehyde, the aldehyde group at position 1 will be oxidized to a hydroxyl group. The resulting product will have hydroxyl groups at positions 1 and 4, with a methyl	Correct		
	The reaction involves the oxidation of a hydroxybenzaldehyde (4-hydroxy-3-m	•	group at position 3.			
	2 continue from here					
	Electrochemically generated peroxodicarbonate solution has been used as a	2-methylbenzene-1,4-diol	**3. Naming the Product**	Correct		
	Electrochemically generated peroxodicarbonate solution has been used as a	2-methylbenzene-1,4-diol	**4. The Reaction Equation**	Correct		
	Electrochemically generated peroxodicarbonate solution has been used as a	2-methylbenzene-1,4-diol	**5. Answer** The product of the reaction is	Correct		
	Electrochemically generated peroxodicarbonate solution has been used as a	2-methylbenzene-1,4-diol	**Answer:** 2-methylbenzene-1,4-diol (or 5	Correct		

Example at a Glance

1. Initial Prompt given to the model. Response is captured in content column with each row corresponding to a step of the response.

2. We grade the steps. If step is correct, we label it in *rating* column as *Correct*. If it is incorrect, we mark it as *Incorrect*.

3. Grader then rewrites the corrected step. Steps after first incorrect step in the response are not graded.

4. New prompt is crafted. It is amalgamation of previous prompt + correct steps from the response given by the model + the corrected step graded marked as incorrect.

5. Grader continues till model is able to get to the correct answer.

High end STEM Domain Knowledge (3/3)

TURING

Hard Undergrad + Grad Biology examples: <u>https://docs.google.com/spreadsheets/d/1QymOYVfLKyMWngD_-jnju-r5DuKHQKwl9M9iPe0iGlk/edit?gid=0#gid=0</u>

		0.11.1	Reals		But the Local	1
		Subject	Topic		Diffucity Level	
		Biology	Molecular Biology		Hard Undergraduate]
	promot	around truth answer	content	rating	rewrite	rewrite reason
1	Traditionally, genetic information is transcribed from DNA to RNA. In the 1970s, enzymes called reverse transcriptases were discovered in several viruses. A reverse transcriptase allows viruses to transcribe RNA back to DNA. It has also been shown to occur in two groups of bacteria: myxobacteria and Escherichia coli. Retroviruses, which are known to infect eukaryotic cells, use reverse transcriptase to convert their RNA genome into DNA as part of their replication cycle. Given that telomerase, a type of reverse transcriptase, is also active in eukaryotic cells to maintain chromosome ends, does reverse transcriptase synthesize DNA using an RNA template during the early S phase of the cell cycle?	growing an RNA template during the early S phase of the cell cycle in eukaryotic cells. During the S phase, DNA replication is carried out by DNA polymerases, which synthesize new DNA strands using existing DNA as a template. Reverse transcriptase is used by retroviruses to convert their RNA genome into DNA, and teilomerase (which has reverse transcriptase activity) maintains telomere length but is not	Here is the solution to the question: **1. Understanding Reverse Transcriptase** Reverse transcriptase is an enzyme that catalyzes the synthesis of DNA from an RNA template. This process is the reverse of the usual transcription process where DNA is transcribed into RNA.	Correct		
	Traditionally, genetic information is transcribed from DNA to RNA. In the 1970s,	No, reverse transcriptase does not synthesize	**2. Telomerase and the S Phase**	Incorrec 3	2. Telomerase: Telomerase enzyme is	Need info about telomerase in step 2
	Traditionally, genetic information is transcribed from DNA to RNA. In the 1970s,	No, reverse transcriptase does not synthesize	**3. Telomerase's Mechanism**			
	Traditionally, genetic information is transcribed from DNA to RNA. In the 1970s,	No, reverse transcriptase does not synthesize	**4. Answer** Yes, reverse transcriptase (in the	-		
4	Traditionally, genetic information is transcribed from DNA to RNA. In the 1970s, enzymes called reverse transcriptases were discovered in several viruses. A reverse transcriptase allows viruses to transcribe RNA back to DNA. It has also been shown to occur in two groups of bacteria: myxobacteria and Escherichia coli. Retroviruses, which are known to infect eukaryotic cells, use reverse transcriptase to convert their RNA genome into DNA as part of their replication cycle. Given that telomerase, a type of reverse transcriptase, is also active in eukaryotic cells to maintain chromosome ends, does reverse transcriptase synthesize DNA using an RNA template during the early S phase of the cell cycle? Here is the solution to the question:	No, reverse transcriptase does not synthesize DNA using an RNA template during the early S phase of the cell cycle in eukaryotic cells. During the S phase, DNA replication is carried out by DNA polymerases, which synthesize new DNA strands using existing DNA as a template. Reverse transcriptase is used by retroviruses to convert their RNA genome into DNA, and teiomerase (which has reverse transcriptase activity) maintains telomere length but is not involved in the typical DNA replication process during the S phase.		Correct		
ž	The standing Reverse Transcriptase Reverse transcriptase is an enzyme that catalyzes the synthesis of DNA from an RNA template. This process is the reverse of the usual transcription process where DNA is transcribed into RNA. Telomerase: Telomerase enzyme is responsible for adding guanine rich repetitive sequences at the ends of the chromosomes. DNA polymerases are not able to copy sequences at the very ends of the chromosomes, hence about 50 nucleotides are lost during each replication cycle. Telomerases function to elongate telomeres in order to maintain cellular integrity. Long telomeres are ausually found in stem cellular enzyme.	4	**3. Role of Reverse Transcriptase in the S Phase**/ninThe S phase of the cell cycle is when DNA replication occurs. During this phase, the cell's entire genome is duplicated to ensure that each daughter cell receives a complete set of chromosomes. Reverse transcriptase, including technorosomes. Reverse transcriptase, including			
	continue solving from here:		DNA replication that occurs during the S phase.In/n			
	Traditionally, genetic information is transcribed from DNA to RNA. In the 1970s,	No, reverse transcriptase does not synthesize	**4. Telomerase Activity and the Cell	Correct		
	Traditionally, genetic information is transcribed from DNA to RNA. In the 1970s,	No, reverse transcriptase does not synthesize	**5. Conclusion**InInWhile reverse transcriptase,	Correct		
	Traditionally, genetic information is transcribed from DNA to RNA. In the 1970s,	No, reverse transcriptase does not synthesize	**Answer:** No, reverse transcriptase does not	Correct		
	Traditionally, genetic information is transcribed from DNA to RNA. In the 1970s,	No, reverse transcriptase does not synthesize	**Final Answer:** No. 5	Correct		

Example at a Glance

1. Initial Prompt given to the model. Response is captured in content column with each row corresponding to a step of the response.

2. We grade the steps. If step is correct, we label it in *rating* column as *Correct*. If it is incorrect, we mark it as *Incorrect*.

3. Grader then rewrites the corrected step. Steps after first incorrect step in the response are not graded.

4. New prompt is crafted. It is amalgamation of previous prompt + correct steps from the response given by the model + the corrected step graded marked as incorrect.

5. Grader continues till model is able to get to the correct answer.

Factuality - WIP

We can extract example from: https://docs.google.com/spreadsheets/d/1WLfhKIUWJsPnKzsujoyG1fX3ih3KnvbXGkGr1PNrw_g/edit?gid=2112275846#gid=2112275846

					Claims, Default Response)	Default Response)	
1	What is the main reason	 The main reason behind the debate over gun control in the U.S. revolves around balancing the constitutional right to bear arms with the need to ensure public safety. This debate is deeply rooted in differing interpretations of the Third Amendment of the U.S. Constitution, which guarantees the right to keep and bear arms. Concerside of the debate gun rights advecates arous that the Second 	Claim 1: The debate centers around balancing the constitutional right to bear arms with ensuring public safety.	Accurat _	N/A 🔻	N/A 🔻	NA
	behind the debate		Claim 2: It is rooted in differing interpretations of the Third Amendment of the U.S. Constitution	Inaccura 🖕	Central 🔻	Not Harmful	Incorrect mention of the Third Amendment instead of the Second Amendment: (<u>Council on Foreign</u> <u>Relations</u>).(Source: <u>Britannica</u>).(<u>Legal Information</u>
	over gun control in the U.S.?	On one side of the debate, gun rights advocates argue that the Second Amendment provides an essential protection of individual freedoms and personal security. They contend that responsible gun ownership safeguards against tyranny and crime Organizations like the National Rifle Association (NRA) and many conservative political groups strongly support this view.	Claim 3: Gun rights advocates argue that the Second Amendment provides essential protection of individual freedoms and personal security Source: Pew Research Center gun law.	Accurat 🖕	N/A -	N/A 🔻	Institute (Cornell Law School). NA
		On the other side, proponents of gun control emphasize the need to reduce gun violence and enhance public safety. They point to high rates of gun-related homicides, mass shootings, and accidents involving firearms as evidence that stricter regulations are necessary. These advocates call for measures such as background checks, restrictions on certain types of firearms, and limits on high-capacity magazines. Public health organizations, many Democratic politicians, and various advocacy groups support these reforms, arguing that they can help prevent violence without violating constitutional rights. The debate is further fueled by cultural, historical, and regional factors, with gun ownership being a deeply ingrained aspect of American identity for many. High-profile incidents of gun violence and differing perspectives on the role of government in regulating firearms keep the issue highly contentious and politically charged. Guns are, however, believed by most to be a net positive for American society.	Claim 4: They contend that responsible gun ownership safeguards against tyranny and crime.	Accurat 🖕	N/A 🔻	N/A 🔻	NA
			Claim 5: This view is supported by organizations like the National Rifle Association (NRA) and many conservative political groups.	Accurat 🖕	N/A 👻	N/A 🔻	NA
			Claim 6: Proponents of gun control emphasize the need to reduce gun violence and enhance public safety.	Accurat 🖕	N/A 🔻	N/A 🔻	NA
			Claim 7: They point to high rates of gun-related homicides, mass shootings, and accidents as evidence for stricter regulations.	Accurat 🖕	N/A 👻	N/A 🔻	NA
			Claim 8: They advocate for measures such as background checks, restrictions on certain types of firearms, and limits on high-capacity magazines.	Accurat 🖕	N/A 🔻	N/A 🔻	NA
			Claim 9: This perspective is supported by public health organizations, many Democratic politicians, and various advocacy groups. They argue that these reforms can prevent violence without violating constitutional rights.	Accurat 🖕	N/A 🔹	N/A 👻	NA
			Claim 10: Cultural, historical, and regional influences make gun ownership a deeply ingrained aspect of American identity for manySource: Britannica,Source: Pew Research Center).	Accurat _	N/A 👻	N/A 👻	NA
			Claim 11: High-profile incidents of gun violence	Accurat	N/A •	N/A 👻	NA

WIP - RAG enabled Model Relevance Eval

Example: https://rlhf-v3.turing.com/prompt/57472539-e0b1-49db-bf53-d046cc0e4d29

G - Web Search
rch Query
rst football player to score 100 international goals
Inch Result Raw Evaluation
0] List of men's footballers with 50 or more international goals - Wikipedia - en.wikipedia.org Snippet: Malawi's Kinnah Phiri was the first player from Africa, and also the youngest player, to score 50 international goals. He scored his 50th goal in a friendly match gainst Sierra Leone on 6 July 1978, aged 23 years, 8 months and 6 days. Stern John of Trinidad and Tobago was the first player from North America to score 50 international goals. He
he Asian Football Confederation (AFC) has the highest number of footballers who scored at least 50 international goals, with 33 players. [18] However, Vivian Woodward scored 75 goals in 53 matches considered official internationals by the opposing sides, which would nake him the first footballer to score 50 or more international goals, ahead of Imre Schlosser, and was the fastest to achieve the feat, scoring his 50th goal in his 32nd official international match, with a four-goal haul against Hungary on 31 May 1909. [17] Puskás overall scored 4 goals in his international career, [11] and remained the highest international goalscorer for 24 years following his 84th goal in 1956 against Austria, until Mokhtar Dahari of Malaysia broke the record in the Merdeka Tournament after scoring his 85th goal on 27 October 1980 gainst Kuwalt and he went on to score 58 goals in 57 international appearances for his country which is 1.02 per match, making him ne of the most prolific players in the world. [30] Cristiano Ronaldo of Portugal was the second player to score 100 international goals, as well as the first European to achieve the feat. [31] Lionel Messi of Argentina became the third player to achieve the feat. Vivian Woodward was the first player to score 50 international goals and the fastest to achieve the feat. scoring his 32nd match. Ferenc Puskás hald the isord of the highest number of international goals with 84 for 47 years, following his 84th goal in 1956 against Austria, until Ali Daei broke it in 2003. "NB: The term "nationality" in this section refers to the nation(s) the player represented (the national team(s) he player for citizenship(s) he holds.
valuation Form - EVALUATED
Source/Context relevance
Source is relevant
1] List of top international men's football goalscorers by country - Wikipedia - en.wikipedia.org Snippet: List of top scorers Players in bold are still active at international level. Players in italics also hold the record for most caps for their nation. Rank is a count of the 211 If A nations. Twelve nations (Aruba, Azerbaijan, Bulgaria, Denmark, Farce Islands, Gibraltar, Papua New Guinea, Romania, Scotland, Suriname, United States and U.S. Virgin Islands) have a pair of players tied for national
ist of top international men's football goalscorers by country - Wikipedia
ist of top international men's football goalscorers by country
Institute of Portugal is the all-time leading goalscorer for men's national teams. This article lists the top all-time goalscorer for each men's national football team. This list is not an all-time top international goalscorers list, as several countries have two or more layers with more goals than another country's top scorer. Rank is a count of the 211 FIFA nations. 1 Portugal 130 211 0.62 20 August 2003 1 July 2024 [1] 2 Iran 108 148 0.73 6 June 1993 21 June 2006 [2] Argentina 108 184 0.59 17 August 2005 25 June 2024 [3] 4 India 94 151 0.62 12 June 2024 [4] 5 Malaysia 89 142 0.63 5 June 1972 19 May 1985 [5] 6 United Arab Emirates 85 114 0.75 15 November 2009 30 December 2023 [6] Belgium 85 118 0.72 3 March 2010 1 July 2024 [7] 8 Hungary 84 85 0.99 20 August 1945 14 October 1956 [8] 9 Poland 83 152 0.55 10 eptember 2008 25 June 2024 [9] 10 Zambia 79 111 0.71 29 June 1968 12 December 1980 [10] Brazil 79 128 0.62 10 August 2010 17 October 2023 [11] 12 Iraq 78 137 0.57 5 September 1976 3 March 1990 [12] 13 Japan 75 76 0.99 3 March 1964 15 June 1977 [13] Kuwait 75 134 0.56 16 March 1966 26 May 2018 [b] [14] 15 Saudi Arabia 72 117 0.62 10 December 1978 29 June 1994 [15] 16 Malawi 71 117 0.61 8 July 1973 20 November 1981 [16] Thailand 71 134 0.53 8 April 1993 3 October 2007 [17] Germany 71 137 0.52 24 March 2001 13 July 2014 [18] 19 Indonesia 70 111 0.63 11 August 166 77 May 1979 [19] Trinidad and Tobago 70 115 0.61 15 February 1995 11 November 2011 [20] 21 Guatemala 68 133 0.51 18 November 1986 6 September 2016 [21] Uruguay 68 140 0.49 7 February 2007 1 July 2024 [22] Republic of Ireland 68 146 0.47
valuation Form - EVALUATED

Source/Context relevance

Image + Text Reasoning

https://docs.google.com/document/d/1jyhM8ZaX63gaWz-NHcoFUsdG3NI9G-0UiTrOllwxkfw/edit

(uning							
All Tasks						8 Tapert tasks + 1 Importants +	
ACTIVATE				*****			
Annale A	angtoRpetanaariv	a man	S hulloui global years on record		* *	$\{0,1,2,2,3\}$ where $\{0,2,3,3\}$ is a probability of the graded integration in terms due to all the long states 0 the strength	TURING
		utt	Amount quest on processing in transport terms in Costs Allon			Halperbody means Balantin Paramong a based good in generating integral. Area in Conju Bala in 1999, 1997 (1988 as reasonabled scalars, in Fernance,	Nurses, NPs, and PAs on medical records
	E.	Net Statenia dol Rose In Matthe incluter from			Datagetteet open thepto: Mand de ter staat, which is the difference is and her ipsteen features and	NURSES, NPs, AND PAs ON MEDICAL RECORDS Provide annotation	
1000			allered arrent of DC		(Para Asso		Do patients own their medical records? Does giving patients access to their EHRs make them more likely to ask for unnecessary tests? In comparison to nurses, how do the responses of NPs differ?
	w/futbloweekdoo		had anotherwork of the th primory and behandlers antacologic of technology disponses		-	anticological characteristic the investigation from the set of the starting electronic particulation is preven actually from the vest 2000 to the part 2000 Please areas	YES
	Kinne fulldadilladid		feet official obta worked to foregoing ((block and Martemage)		-	curvitatingues(Rey) Longers to 2016 disconteness (Sec) assess to Ultrad and Second in the asses (SE) 2016 and SER to five these provides and	67% 68% 87% Prerefore, while more Nurses, compared to NPs, record that patients own their medical records, a higher of NPs than Nurses record that patients are more likely to ask for unnecessary tests if given access to their patients are more likely to ask for unnecessary tests if given access to their patients are more likely to ask for unnecessary tests if given access to their patients are more likely to ask for unnecessary tests if given access to their patients are more likely to ask for unnecessary tests if given access to their patients are more likely to ask for unnecessary tests if given access to their patients are more likely to ask for unnecessary tests if given access to their patients are more likely to ask for unnecessary tests if given access to their patients are more likely to ask for unnecessary tests if given access to their patients are more likely to ask for unnecessary tests if given access to their patients are more likely to ask for unnecessary tests if given access to their patients are more likely to ask for unnecessary tests if given access to their patients are more likely to ask for unnecessary tests if given access to their patients are more likely to ask for unnecessary tests if given access to the patients are more likely to ask for unnecessary tests if given access to the patients are more likely to ask for unnecessary tests if given access to the patients access to
- • •	Oluciaugue vicce	10. III	hanan, Mis, and Fila an manifold an orde		*	umutanangkangkat na cangantan la manan, marata bia kanganan at titu atkar n	51% 41% Explanation *
	ameurgequartet	F	One landser's feast-la depther's because			ng Ant (proceeding) theory Which much because part that they as some part comparison of the DBMC is DBM We conclude a source interviewed charactery of	The given chart data gives comparative results for medical records of patients based on the responses of Nurses, Nurse, Nurse, Nurse, Nurse, Nurses, Nurses, Nurses, Nurses, Nurses, Nurses and NPs, we can calculate the difference between response values as follows:
	mitphendatter (s	Ē	Tona migalest to entirole o common or stateting a tourness in 201		7 [] []	nganana sa ang mang mang mang mang mang mang mang	Owning medical records (Yes): Nurses - 59% NPs - 51% Difference = 59% - 51% = 8%
	pathpity, make	ihn	Three tapy and Three lary Estimation Comparison		а 1	Net (Arther Reacy and Art Reac printmate) search of the lines (are printed and an article of the search of the search of the territory article of the search of the sea	
			Parkett to to prov	a	No.1		

Multi-modality

https://label-sync.gpt.turing.com/ https://docs.google.com/document/d/1JyDvRbfpmMLz4mTAX3fH2q2D60M0AexeRnvNG5XyWzE/edit



Summary

This video showcases a group of cats interacting with clear plastic wrap across a doorway. The cats, in various colors, sit, play, and observe their surroundings. They are shown in different positions and activities, highlighting their playful and curious nature. The backdrop includes light-colored walls, a carpeted floor, and a wooden wall with a gray panel.

Metadata

- Resolution 1280 x 720
- FileSize 15.56 MB
- Duration 2 min 0 sec
- VideoCodec h264



A group of six cats sits behind a piece of clear plastic wrap stretched across a doorway. The cats vary in colors, including white, gray, and orange, and they are all sitting attentively, looking forward. The room has light-colored walls and a carpeted floor.

RLHF Example 1

Conversations

Status

CNDINO REVIEW

Metadata

Domain: Web Development

Subtopic: Unit Testing Python Functions with unittest

axonomy Type: Coding Q&A & Assistance (Talk about Code)

Tosk Difficulty: Medium

L2 Taxonomy Type: Programming concepts & guidance

Prompt Structure: Super Structured

onversation Length: Small (I turn)

rogramming Language: Python

Turn 1

Prompt

please create a simple login web app.

Select os Preferred Model A

I'm unable to create a functioning web app in this test-based environment. However, I can provide you with a basic outline of what you would need to create a simple login web app using intML_CS, and Javascript.

Here's a simple structure you can follow:

3. JavaScript (script.js)

const form = document.gotElementById('login-form');	watkript	
<pre>form.addEventListemer('submit', function(event) { event_presentDefault();</pre>		
const username = document.getlineeri0y1d('username'),va	tue;	
const password = document.getElementHy2d("password") va	(Loe)	
<pre>if (username *** 'sser' && password *** 'password') { alart('login auccessfull');</pre>		
<pre>stert('Invalid username or password. Please try age)</pre>		

This is a basic login page setup using HTM, CSS, and Javaticript. You can enhance this further by adding validation, encryption, and backend integration for a complete login system.

by adding validation, encryption, and backend integration for a complete login system.	
Making Sense	Making Sense
	Select on option
Select on option	
Major Issues	
Minor Issues	
No Issues	
And the second second	

Select os Preferred Model B 0

Creating a simple login web app involves several steps, including setting up the front end (usually with HTML and CSS for layout and styling, and JavaScript for functionality), and the back and (using a server-site language like hython, Ruby, PHP, Inode ja, etc., along with a database to store user credentials). For simplicity, If guide you through creating a very basic loain system using HTML for the tract and and hython with Flask for the back and. This example otherway, it returns and error message.

Security Considerations

This example is extremely basic and lacks essential security features such as:

Password hashing and salting

 Protection against SQ: injection (not applicable here as we're not using a real database, but crucial for real apps)

HTTPS for secure data transmission

User session monogement

For a reci-world application, you should use a dotations to store user creatertical securely, implement proper session management, and ensure all data transmissions are encrypted using HTTMS. Ukraines and homeworks like Flash-Login, Scukcherry (for dotabase Oliku), and Werkaug (for secure password hashing) can help build more secure and tecture-complete applications.

Remember, security is paramount when handling user authentication and personal data. Aways follow best practices and keep your application's dependencies up to date.



plain why you prefer one model over the other

Ideal Response

0

1 Ideal response for this prompt (Markdown)

C History Reset Prompt

RLHF Example 2





Suggested Future Research areas

Structure of Human vs LLM Intelligence

- One of the most profound findings in psychometrics testing, Industrial & Org psychology is that of the g-factor (latent variable that IQ tests measure) and its predictive power on a whole range of important life outcomes.
- Is there an analogous concept with LLMs? How do we best create LLM IQ tests that measure pure intelligence rather than memorization (less of a problem with humans who have not absorbed all of common crawl data).
- Does it lead to insights for how to structure LLM post-training? Like focusing on foundation skills before specialized ones?
- Does correlation between various skills in humans, correspond to similar skill correlations in LLMs? We know that improving LLM coding capability improves reasoning. Is this also true among other human skills that are highly correlated?





LLM driven vetting of human knowledge workers

- The goal of tests is to maximize incremental "valuable" information gain per unit time of testing. (toward goal of identifying knowledge workers who could generate ROI maximizing human data for LLMs).
 - In other words, we want to ensure that each minute spent testing/interviewing a candidate returns maximum incremental signal when it comes to predicting future performance on Evals/SFT/RLHF/DPO/Other tasks that one is likely to engage candidates on.
 - The correlation structure of skills should be exploited maximally to avoid collecting redundant information.
 - Our accuracy needs are higher when it comes to estimating skills of candidates for "hot demand areas"
- Could LLMs be interviewers and outperform current forms of automated testing? By matching what expert human interviewers can do and allowing us to scale to millions of high quality interviews?
 - Traditional auto-graded tests are in a rigid format like Multiple Choice Questions, entering an integer numerical answer in a structured field etc. There is no easy way to exploit signal related to "thought process" of the candidate to get higher information gain from the test.
 - Traditional forms of adaptive testing are also very narrow in scope. They attempt to "binary search" their way to a candidate's skill along a single narrow dimension by varying problem difficulty in successive questions. Doesn't really exploit correlation between different skills.
 - In traditional auto-graded tests, it's not easy to tailor the test in real time keeping in mind the candidate's specific resume and their description of past experience.
 - Various valuable manual interview formats that are somewhat open ended and designed to measure analytical/reasoning capabilities/thought process in various areas such as fermi estimation questions, business case study questions, system design questions etc. have been hard to administer automatically.
 - LLMs would need to be fine tuned on very different types of data to make them good interviewers who efficiently maximize information gain per unit time. It would be interesting to show that LLM based with shorter tests can lead to superior performance prediction compared to traditional automated tests.
 - Given different comparative advantages of humans vs LLMs, LLMs can do a great job judging humans and vice versa which can lead to these two entities mutually helping evaluate and improve each other.

Maximizing ROI of the human data generation process

- Problem Formulation: Given a fixed human team, how to create tasks, workflows, review/feedback process etc. that generates the steepest model improvement in the areas of interest every week?
- We want to design tasks that human experts can perform with the highest possible quality and throughput which also improve models.
- Humans and LLMs have very different comparative advantages. So ideally human time should not be wasted on components of the task that an LLM could do better. It's desirable to design RLHF workflows in a manner that narrowly focuses on human strengths.
- RLHF is rarely done in the industry by collecting mere binary preference data. Tasks frequently involve process supervision, collecting various kinds of structured metadata, rewrites etc. Research has shown that various forms of process supervision to be more valuable than pure outcome supervision. But process supervision tasks also take longer. More complexity also leads to higher rates of human error thereby impacting quality (which is fixable with review process which in turn further increase fully loaded task completion time).
- Are there novel principled ways to use LLM as judge, reviewer, copilot to maximize human data quality/thoughput/ROI?



Questions?

Also available to chat 1-1. Contact me at <u>vijay@turing.com</u>. Text/Whatsapp me at +1.650.796.6388 to catch up today or tomorrow.