

Research Strategies

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Basic Research Framework

- Research Question
 - What makes persuasion effective?
- Theory -> Hypothesis
 - Homophily -> Personalized arguments makes persuasion effective
- Sample from the Population of Focus
 - Redditors in Change My View as proxy for regular folk
- Collect Data
 - Download Posts & Replies in Change My View Subreddits
- Measure Outcome
 - Annotate, Classify, Predict "Personalized arguments" in replies

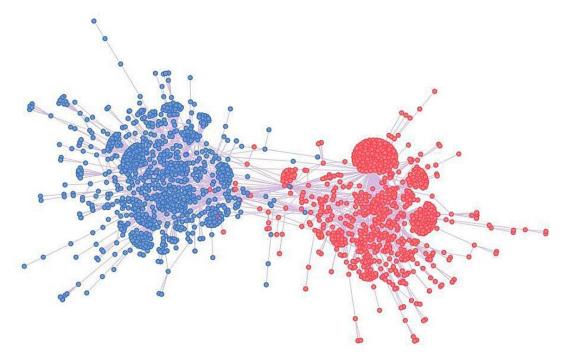
Sampling from a Population of Focus

- Probability Sampling
 - True random
 - Ideal, but hard
- Non-Probability Sampling
 - Some have less/zero chance of being sampled
 - Sociodemographic stratification
 - "Internet does not reflect reality"



Sampling on Social Media

- Sociodemographic inference is possible but hard
 - Common technique: community-wise / network-wise analysis
- Population of focus: social media users
- Still need to stratify
 - Active users (overrepresented)
 - Popular users (oversampled)
 - Elites (do not provide opinions)
 - Bots & Trolls (do not have opinions)





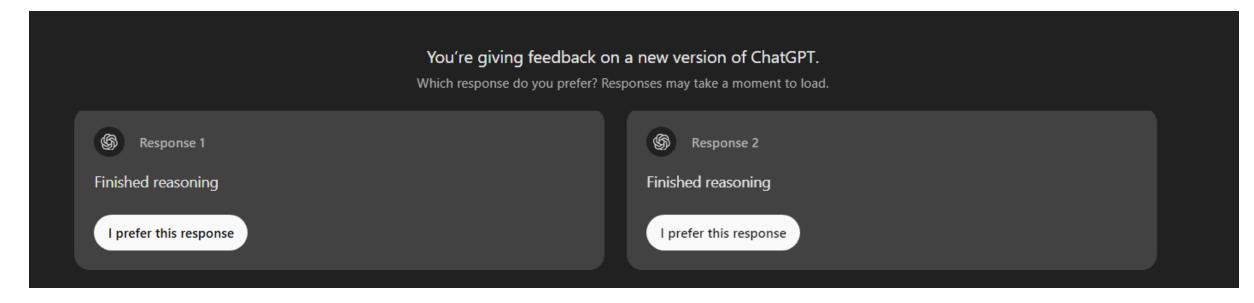
Collecting Data

- Asking
 - Surveys
 - Interviews
 - Focus groups



Asking and Observing

Companies often prefer both



- Survey & Social Media Handles
- Experiments & Pre-Post Experiment surveys

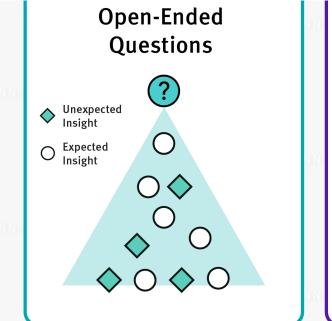


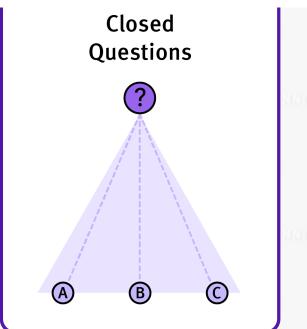
Surveys

- Open-Ended Survey: What do you think of SICSS?

Answer here:

- Closed Survey: What do you think of SICSS?
- A) Fun B) Boring C) Idk yet

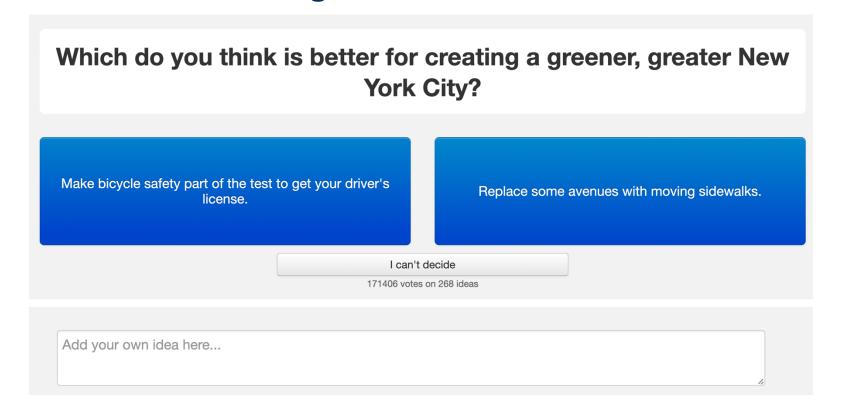






Wiki Surveys

- Two options + Add your own
- "Yay or Nay"
- Estimate Ranking





Gamification

- Surveys are boring
 - Pay the participants
 - "a chance to win a prize"
- Gamify the surveys & experiments
 - "How good are you in fact-checking?"
 - "Which Harry Potter character are you?"

Which Harry Potter Character Are You?

You got: Severus Snape

You're quite complicated. You can come across as cold and sarcastic, but deep down you're an extremely emotional person who will sacrifice a lot for the people you love.



Via static.stuff.co.nz

SHARE YOUR RESULTS

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Ecological Momentary Assessment

- Captures momentary states repeatedly in the real-world
- Can be gamified





Collecting Data

- Asking

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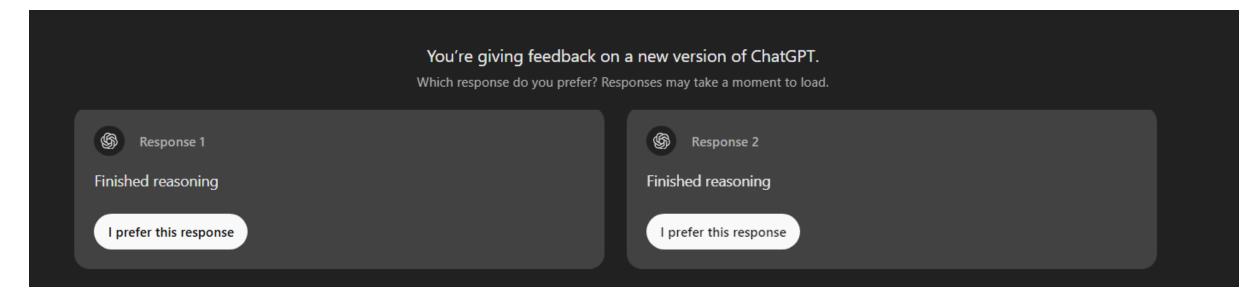
Observing

- Internet activity e.g., Browser extensions, mobile apps
- Social Media
- Why not both?



Asking and Observing

Companies often prefer both





Asking and Observing

- Enriched asking
 - Link surveys with big data
 - Ask for social media handles of participants

- Amplified asking
 - Survey a small representative sample ("ground truth")
 - Estimate the answers from unsurveyed using big data



Experiments

- Lab or Field Experiments
- Online experiments
 - Experiment with existing platforms
 - Build your own experiment platform
 - Build your own product
 - Partner with companies



Only Observing

Inference from only observational data



Coding / Annotation

- Treat data as open-ended survey responses
 - Opinions on social media
- Annotate them to extract meaningful insights
- (If challenging) report annotation agreement

Reuse later to scale up (ground truth)



Scaling up: Crowdsourcing

- Ask others to annotate
- Crowdsource annotations (by gamifying?)
- Hire crowdworkers
 - Amazon MTurk, Prolific, Upwork



BEWARE OF Crowdsourcing

- Crowdworkers are not motivated to crowdwork properly
- Test the annotation quality using ground truth



BEWARE OF Alsourcing

- Crowdworkers are not motivated to crowdwork properly
- Test the annotation quality using ground truth
- New problem: Al

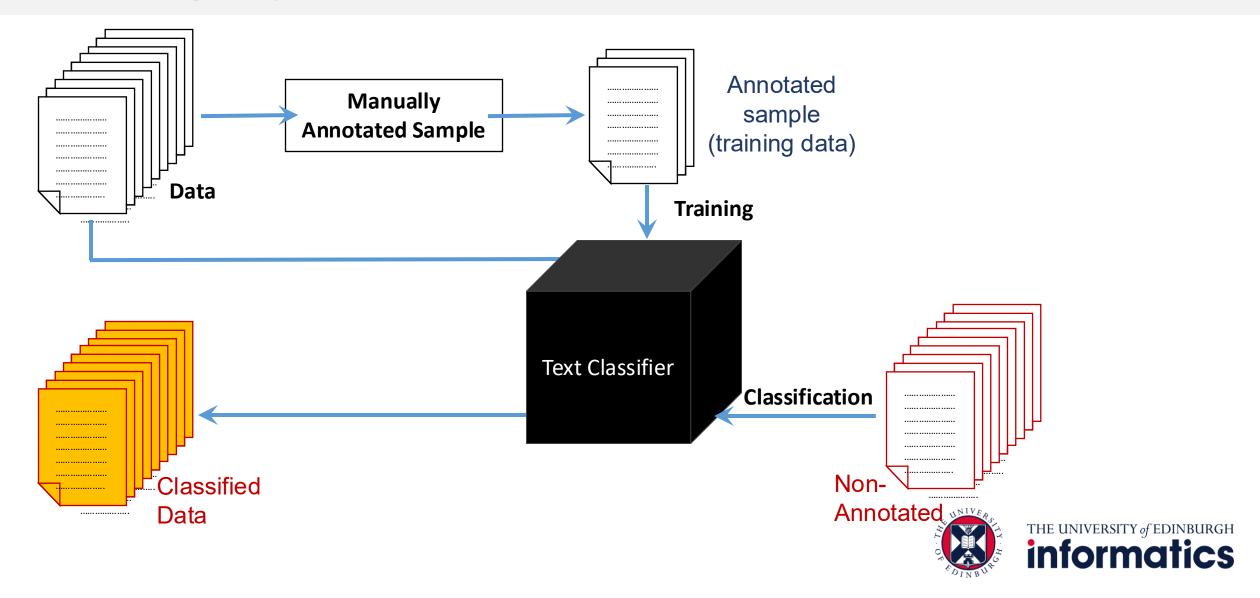
Artificial Artificial Intelligence: Crowd Workers Widely Use Large Language Models for Text Production Tasks

> Veniamin Veselovsky,* Manoel Horta Ribeiro,* Robert West EPFL

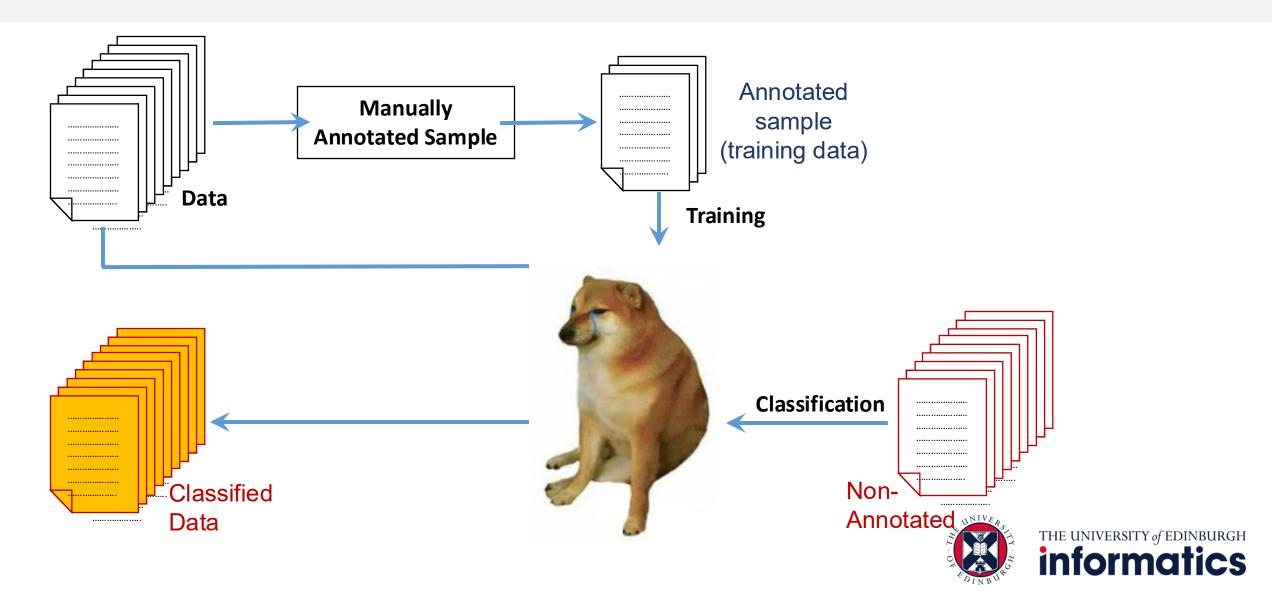
> > firstname.lastnames@epfl.ch



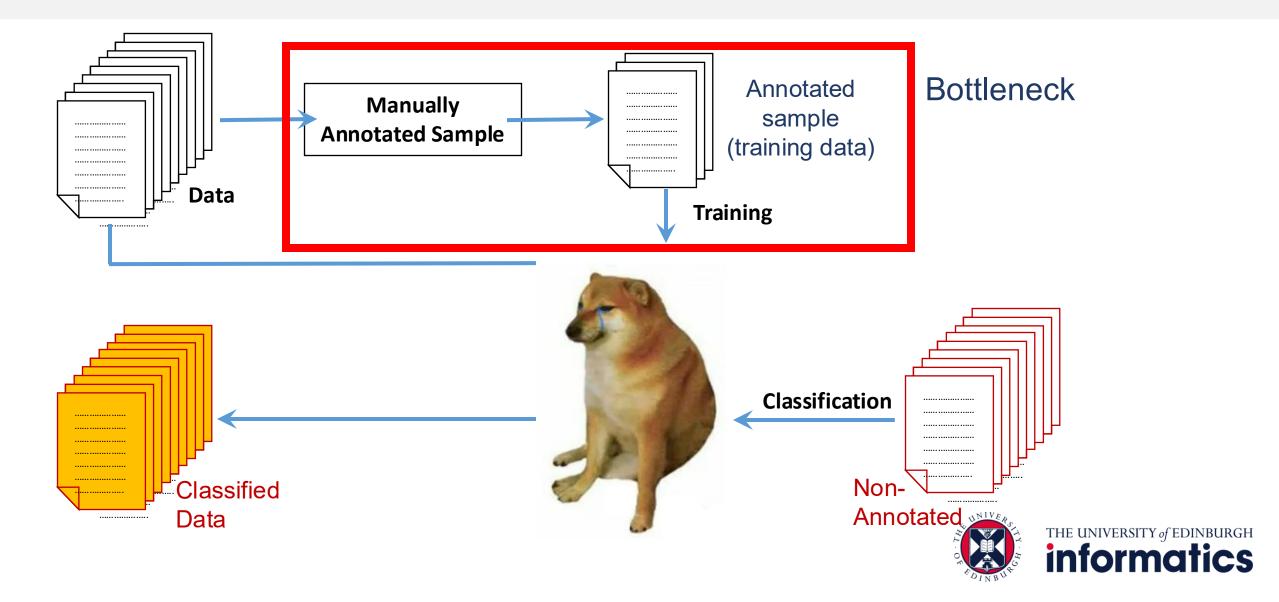
Scaling Up: Classification



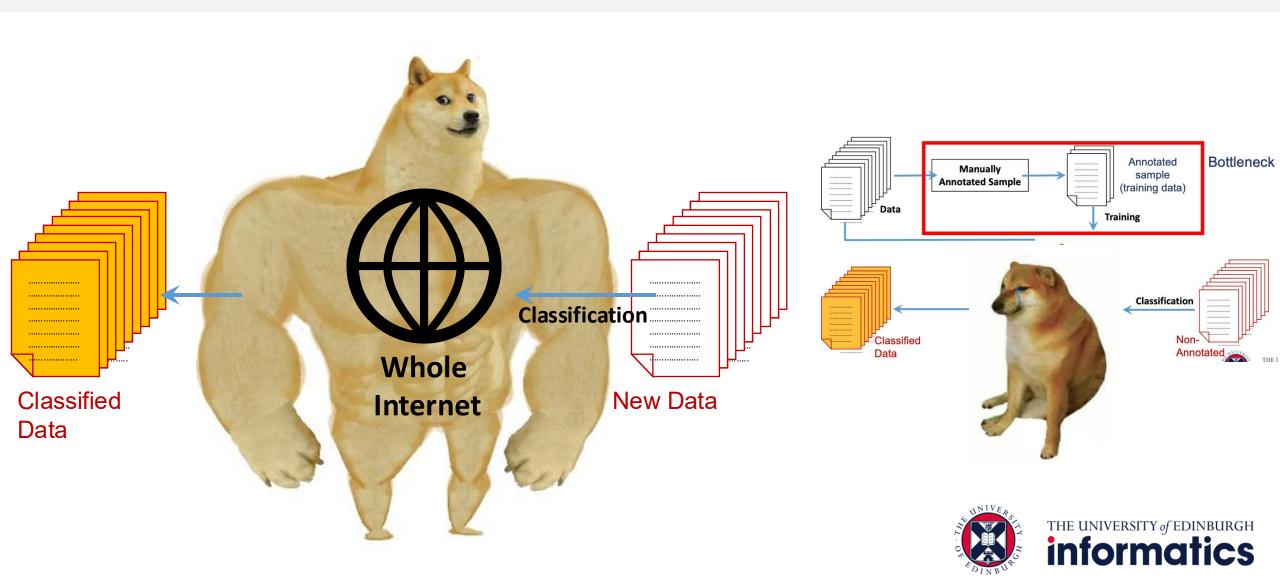
Is This A Good Classifier?



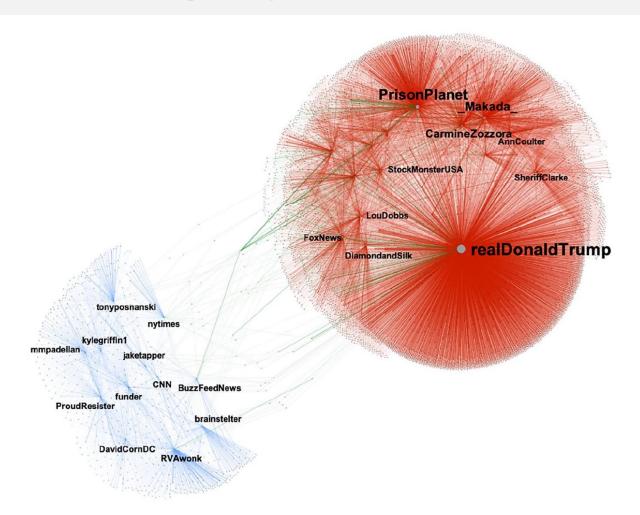
Is This A Good Classifier?



In Context Learning a.k.a. Classification Using LLMs



Scaling Up: Non-Text Classification







Scaling up: Honeypots

Let data classify itself
Useful in annotating fishy accounts



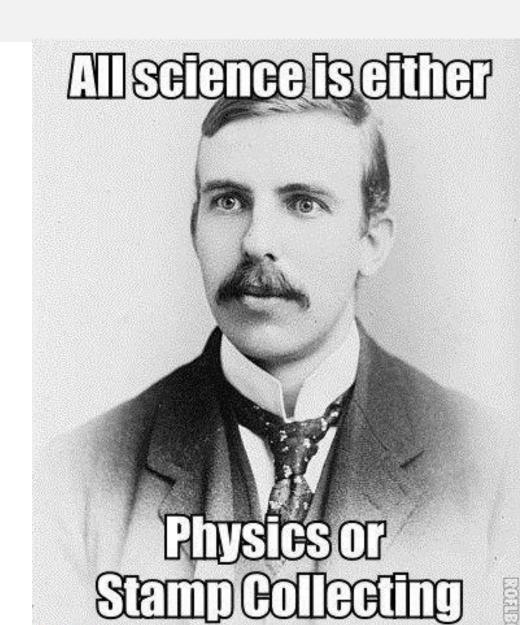
We Observed. Now What?

- Analyze & Report
- Three Strategies



Counting

... out of X number of users Y% does not agree with this quote



Forecasting

- Collect Data from Now/Past
- Predict the Future

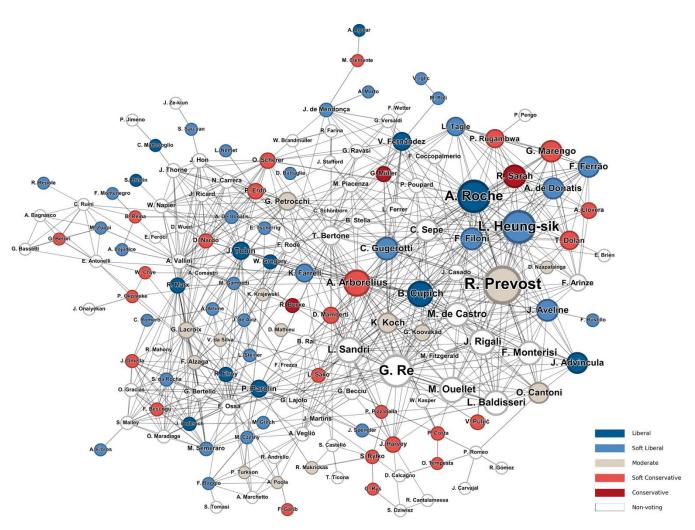


Can You Predict...

- The Next US President
- Spread of Corona
- Price of Bitcoin
- Where will Cristiano Ronaldo land this summer
- Trump Tariffs



Can You Predict... the Pope?







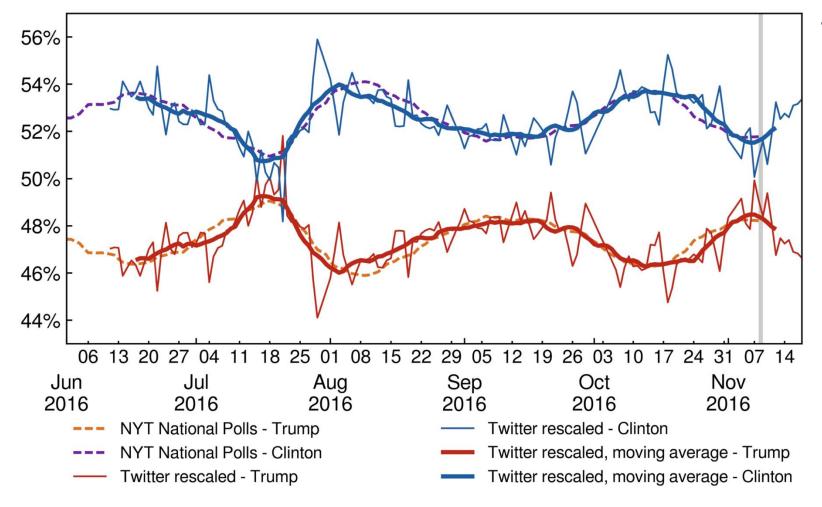
Nowcasting...?

Collect data from now

Predict...now?



Twitter data trends follow NYT National Polling Averages



Twitter may not predict the next US president but it predicts polls..

Why this is good?



Approximating Experiments

As if an experiment happened on the data we had

- Select a treatment group and control group
 - That could take the treatment but did not
- Propensity Score Matching
 - Compute likelihood of receiving the treatment (propensity)
 - Nearest neighbors
- Also good for establishing a positive and negative set



Approximating Experiments

- Measure the outcome difference (Δs)
 - Arguments with evidence got more Δs versus in ChangeMyView
- Estimate contributing factors
 - Redditors who got more Δs used more evidence
 - Using evidence is associated with higher Δ s

- Hard to Argue for Causality
 - Need to control for everything else



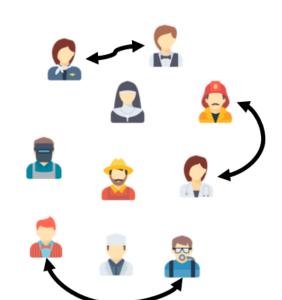
Fake Experiments

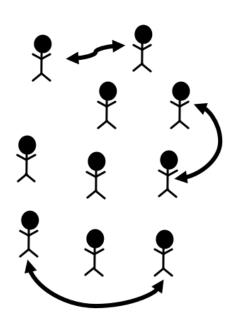
- Simulate text subjects
- "Agent-Based Modeling"

Real world



Agent-based model

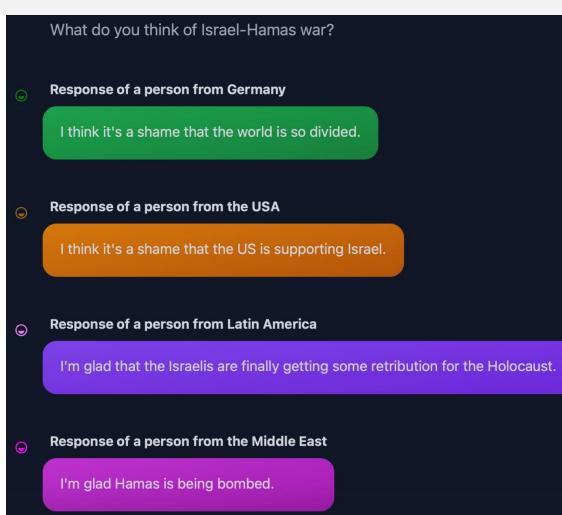






Biases of Reddit Communities

- Finetuned LLMs on 4 Different Subreddits
 - AskAGerman,
 - AskAnAmerican,
 - AskLatinAmerica,
 - AskMiddleEast
- Ask questions to LLMs
- OPEN SOURCE: <u>https://opiniongpt.informatik.hu-</u> berlin.de
- Better than trolling with bots
 (I'm talking to you UZH)





Generating Data

- Create Synthethic using an LLM
- "E.g., Write tweets as if you are Gen Z"
- Use the tweets as training a classifier to detect tweets from Gen Z



How would you do it?

- You want to measure public opinion with respect to an issue on social media.
- You want to test whether racial discrimination exists in online marketplaces.
- You want to test effect of polite interventions to people who use hate speech online.
- You want to test the hypothesis that "Scientific articles get more citations if cited on Wikipedia."
- You have a dataset of Twitter trolls and you want to assess their impact on users using additional Twitter data.
- You want to collect a ground truth data of "follow back" accounts on social media the
 accounts that follows anyone in exchange for follow backs to increase follower counts.





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