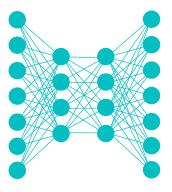
Lecture Notes for

Neural Networks and Machine Learning



Case Studies in Ethical ML





Logistics and Agenda

- Logistics
 - Presentation next time!
- Agenda
 - The Al Principles
 - Case Studies and Discussion
 - Applying the Principles
- Last Time:
 - Course Introduction
 - Stochastic Parrots



Ethical Principles in ML

From Australian Goverment, Department of Science

- **Beneficence**: individuals, society and the environment.
- Respect: respect human rights, diversity, and autonomy of individuals.
- Fairness: be inclusive and accessible, and should not involve or result in unfair discrimination against individuals, communities or groups
- **Privacy**: respect and uphold privacy rights and data protection, and ensure the security of data
- Reliability: reliably operate in accordance with their intended purpose
- Transparency: ensure people know when they are being significantly impacted by an Al system, and can find out when engaging with them
- Contestability: should be a timely process to allow people to challenge the use or output of the AI system
- Accountability: Those responsible for the different phases of the Al system lifecycle should be identifiable and accountable for the outcomes of the Al systems, and *human oversight* of Al systems should be enabled.



The AI Principles

- Be socially beneficial
- Avoid creating or reinforcing unfair bias
- Be built and tested for safety
- Be **accountable** to people
- Incorporate **privacy** design principles
- Uphold high standards of scientific excellence
- Be **made available** for uses that accord with these principles
- Google will not pursue:
 - Tech likely to cause harm, tech that principally is a weapon, Tech that violates surveillance norms, Tech that contravenes human rights



How is Google doing?

FeiFei Li, in an email to other Google Cloud employees:

Opinion: There's more to the Google military Al project than we've been

Google discolves Al ethics hoard just Google hired Timnit Gebru to be an outspoken "Avoid at ALL C mention or impli critic of unethical AI. Then she was fired for it. Weaponized Al. of the most sens AI — if not THE

Gebru is one of the most high-profile Black women in her field and a powerful voice in the new field of ethical AI, which seeks to identify issues around bias, fairness, and responsibility.



What went wrong?

- "First acknowledge the elephant in the room: Google's Al principles"
 - Evan Selinger, professor of philosophy at Rochester Institute of Technology
- "A board can't just be 'some important people we know.' You need actual ethicists"
 - Patrick Lin, director of the Ethics + Emerging Sciences
 Group at Cal Poly
- "The group has to have authority to say no to projects"
 - Sam Gregory, program director at Witness



What about Facebook?

Machine Learning – Facebook Research

https://research.fb.com/category/machine-learning/ -

Our machine learning and applied machine learning researchers and engineers ... The Facebook

Field Guide to Machine Learning, Episode 6: Experimentation.

Missing: ethics | Must include: ethics

Case Studies of (un)Ethical ML

When you penalize your natural language generation model for large sentence lengths









Case Study: ML Generated Reviews

Which of these are fake:

- "I love this place. I have been going here for years and it is a great place to hang out with friends and family. I love the food and service. I have never had a bad experience when I am there."
- "I had the grilled veggie burger with fries!!!! Ohhhh and taste. Omgggg! Very flavorful! It was so delicious that I didn't spell it!!"
- "My family and I are huge fans of this place. The staff is super nice and the food is great. The chicken is very good and the garlic sauce is perfect. Ice cream topped with fruit is delicious too. Highly recommended!"
- Does this violate any ethical guidelines?
- "While this study focuses only on creating review text that appears to be authentic, Yelp's recommendation software employs a more holistic approach," said a spokesperson. "It uses many signals beyond text-content alone to determine whether to recommend a review."
- Does the mere presence of this cause problems of trust?



Case Study: Face Swapping

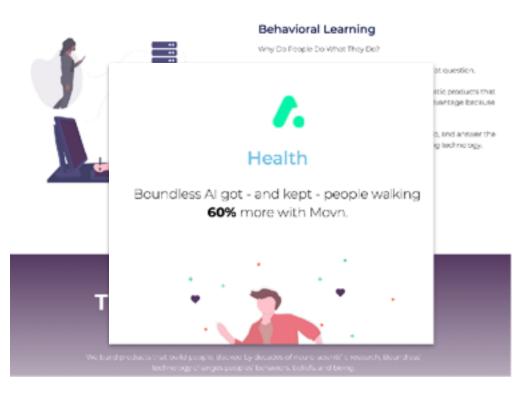
Does the mere presence of this cause problems of trust?





Case Study: Reinforcing App Addiction

- Identifying behavior to keep users in your app
- Does this violate any ethical guidelines?



Ultimately, Dopamine Labs predicts they can add 10 percent to a company's revenues. In practice, their numbers are a bit all over the map, with some companies seeing bounces of more than 100 percent in terms of user interactions with, in or on an app. For other companies the boost could be around 8 percent.



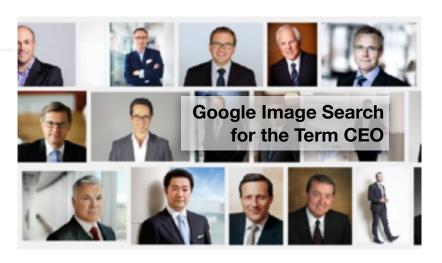
Case Study: Reinforced Gender/Race Bias

- Not a new problem in technology:
 - Example: Crash Test Dummies, Because most crash tests have male "dummies" females had a 20 to 40 percent greater risk of being killed or seriously injured, compared to 15 percent for men.
- But can also be more subtle:

Google's algorithm shows prestigious job ads to men, but not to women. Here's why that should worry you.

"It's part of a cycle: How people perceive things affects the search results, which affect how people perceive things," Cynthia Matuszek, Professor of Computer Ethics at UMD

Does this violate any **Ethics Principles?**



Case Study: Predictive Policing

Once a crime has happened, can it be classified as a gang crime?

Used partially generative NN for classifying if a crime was gang related, with the aim at predicting gang retaliation.

Trained on LAPD data 2014-2016

Does this violate any ethical guidelines?

But researchers attending the AIES talk raised concerns during the Q&A afterward. How could the team be sure the training data were not biased to begin with? What happens when someone is mislabeled as a gang member? Lemoine asked rhetorically whether the researchers were also developing algorithms that would help heavily patrolled communities predict police raids.

Hau Chan, a computer scientist now at Harvard University who was presenting the work, responded that he couldn't be sure how the new tool would be used. "I'm just an engineer," he said. Lemoine quoted a lyric from a song about the wartime rocket scientist Wernher von Braun, in a heavy German accent: "Once the rockets are up, who cares where they come down?" Then he angrily walked out.





Blake Lemoine Al Google Researcher On Bias in ML



Case Study: ML Generated Products

Online generation of content to facilitate buying behavior

It's not about trolls, but about a kind of violence inherent in the combination of digital systems and capitalist incentives. It's down to that level of the metal. This, I think, is my point: The system is complicit in the abuse.

And right now, right here, YouTube and Google are complicit in that system. The architecture they have built to extract the maximum revenue from online video is being hacked by persons unknown to abuse children, perhaps not even deliberately, but at a massive scale.

These videos, wherever they are made, however they come to be made, and whatever their conscious intention (i.e., to accumulate ad revenue) are feeding upon a system which was consciously intended to show videos to children for profit. The unconsciously-generated, emergent outcomes of that are all over the place.

-James Bridle



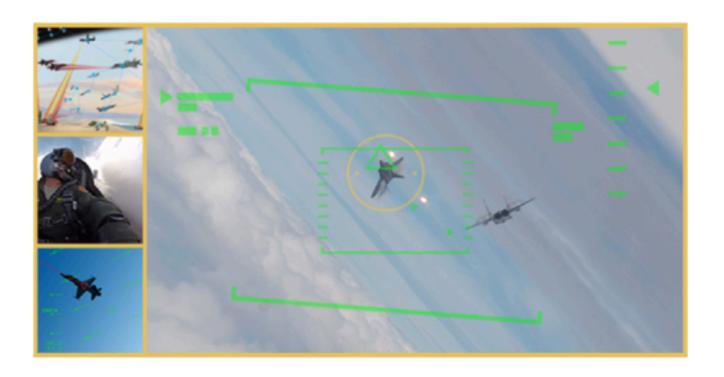
Al Warfare

Defense Advanced Research Projects Agency > News And Events

Training AI to Win a Dogfight

Trusted AI may handle close-range air combat, elevating pilots' role to cockpit-based mission commanders

OUTREACH@DARPA.MIL 5/8/2019





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Next Time:

Practical Example in NLP

Reading: None

