data-ppf.github.io apr 30 2019

lecture 14 of 14: future of data

 $chris\ wiggins\ +\ matt\ jones,\ Columbia$

themes for today

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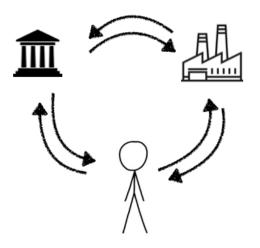


Figure 1: 3 player game

student observations: data

```
59 privacy
32 fairness
30 regulation/regulate
21 power
9 gdpr
6 workers
6 bluetooth
....
3 Fan
```

student observations: some hope, some despair

these readings gave me hope that there is a way to maintain ethical algorithmic practices.

it was refreshing to read articles that offered potential solutions to these problems.

I've never thought about why the U.S. government has had such a "hands-off" approach.

The reading on Apple and Google was really sobering to me

student observations: context

It is clear that the solution to algorithmic biases and injustices cannot be solved without first solving the social conditions that create them in the first place.

fails to account for the preexisting societal injustices that underpin certain algorithms in the first place.

student observations: weapons

In reality, it will take a combination of regulation from the state, from the people, and accountability within the companies

we need a multi-pronged solution

Corporate:

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 - 2. "tech revolt"

Corporate power

Corporate power: privacy

1999, Sun: "you have zero privacy anyway. get over it" -McNealy

2010, Facebook: "Doing a privacy change for 350 million users is really it's not about the type of thing that a lot of companies would do....We decided that these would be the social norms now and we just went for it."

2015, Apple: "privacy is a fundamental human right" -Tim Cook

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- "The Institute of Electrical and Electronics... Ethics Certification Program for Autonomous and Intelligent Systems"

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- Ethics without power is largely toothless, or at least too individualistic to push against the massive shifts in technology and power all around us.
- ▶ Power without ethics is directionless, or at least is likely to serve the interests with the most resources and influence if not directed otherwise.

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- ▶ interest? plea for "new regulatory approach" & "new regulatory agencies must be able to automatically audit algorithms at scale...already feasible at the scientific level"

We believe that curtailing algorithmic misbehavior will itself require more and better algorithms—algorithms that can assist regulators, watchdog groups, and other human organizations to monitor and measure the undesirable and unintended effects of machine learning.

Kearns & Roth, from their book, "The Ethical Algorithm: The Science of Socially Aware Algorithm Design" (2019), quoted in Zimmerman et al.

Zimmerman et al. "Tech can't fix..."

We must resist the apocalypse-saturated discourse on Al that encourages a mentality of learned helplessness.

Developing algorithmic systems entails making many deliberate choices... The algorithm does not define these concepts itself; human beings—developers and data scientists—choose which concepts to appeal to, at least as an initial starting point

tech problems are bigger than loss functions

Tech can't fix: it's on us

it is high time for us as a public to take seriously our responsibilities for the present and looming social consequences of Al. Algorithmic bias is not a purely technical problem for researchers and tech practitioners; we must recognize it as a moral and political problem in which all of us—as democratic citizens—have a stake. Responsibility cannot simply be offloaded and outsourced to tech developers and private corporations.

But we will also have to ask uncomfortable questions about our own role as a public in authorizing and contesting the use of AI technologies by corporations and the state. Citizens must come to view issues surrounding AI as a collective problem for all of us rather than a technical problem just for them.

ACLU on GOOG/APPL

1. Voluntariness — consent

note "privacy by design" vs "oversight" model

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- 6. No Mission Creep tracking should not outlive the COVID-19.

inter-corporate power: setting tech against tech, firms against firms

SOPA 2012

The Stop Online Piracy Act (SOPA): Hollywood promoted bills in the US Congress that would have a created a "blacklist" of censored websites. Dramatic expansion of intellectual property enforcement

Coalition of tech firms and civil liberties organizations, culminating in. . .



Figure 2: Internet Blackout Jan. 18, 2012

privacy

Apple vs. Facebook, Google

Apple vs. US DOJ on encryption

not just "ethics" fundamentally different business models

State power

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- "last substantial [USG] privacy law" 1986 ECPA

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- definition of obligations of corporations only to shareholders

the sith can seem too strong



Figure 3: failed breakup of AT&T

▶ multinational regions (e.g., EU)

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GDPR

May 25, 2018, the General Data Protection Regulation Act came into effect in EU and for EU peoples worldwide

Article 22 states that Europeans "have the right not to be subject to a decision based solely on automated processing."

states/provinces

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 - "A fine up to \$7,500 for each intentional violation and \$2,500 for each

municipalities

July 2019 Oakland, Ca. passes an ordinance preventing the city of Oakland from "acquiring, obtaining, retaining, requesting, or accessing" facial recognition technology, which it defines as "an automated or semi-automated process that assists in identifying or verifying an individual based on an individual's face."

Third city after

► SF May 2019

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- ► Somerville, Mass. June 2019

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re-fanging the state

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- ▶ related: "narrow changes to the 1996 Communications Decency Act (CDA) Section 230", 1996

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- "perhaps this will start a trend"

People power

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- 4. Nonprofit Organizations and Coalitions
- 5. Walkouts, esp GOOG 2018

community organizing in highly tactical ways



Figure 4: Sarah Hamid and the Carceral Tech Resistance Network

People power: "The Tech Revolt"

A sometimes pointed, sometimes resigned conversation with engineers, designers, research scientists, and job candidates who are pushing for a more ethical Silicon Valley

Interviews by Cameron Bird, Sean Captain, Elise Craig, Haley Cohen Gilliland, and Joy Shan

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power and principles

how did new capabilities rearrange power? who can now do what, from what, to whom?

role of rights, harms, justice?

reminder of themes/big main takeaways

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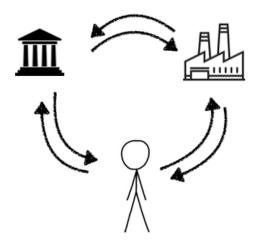


Figure 5: 3 player game

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- ▶ 2019-01-29: 2 of 14 setting the stakes
- ▶ 2019-02-05: 3 of 14 risk and social physics
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- ▶ 2019-02-19: 5 of 14 intelligence, causality, and policy
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- ➤ 2019-04-23: 13 of 14 present problems: attention economy+VC=dumpsterfire

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- ➤ 2019-04-23: 13 of 14 present problems: attention economy+VC=dumpsterfire
- ▶ 2019-04-30: 14 of 14 future solutions