

Ethics in Data Science



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BSDS 100 - Intro to Data Science with R



- Why Ethics?
- Ethics Frameworks
- Ethics Examples

Part I: Why Ethics



- Consent and Ownership
- Biased Algorithms

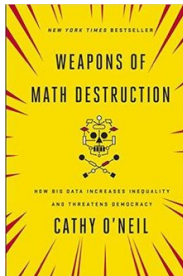


- A fake example... imagine Google makes an algorithm to better recognize faces, they sell it to the police to use as a tool to help them find individuals with outstanding warrants. Google receives \$250 million per year for this software
 - As someone who uses Google, can they use photos I stored in google photos without my consent?
 - Do I have the right to ask them to remove my photos from their training set?
 - If they use my photos to train their algorithm, should I receive a share of the profits?
- Does the answer change if the algorithm will directly benefit or harm me?



- A fake example... imagine I own a company and need to hire a software engineer. I know that I may have an implicit bias toward hiring certain individuals so I decide to screen resumes using an algorithm. To train my algorithm I give it the resumes of the last 100 software engineers who applied to the company the last time we had an opening, labelled with whether we made them an offer or not.
- Why might this produce bias?
 - The training data will already contain my implicit biases, i.e., if I am more likely to hire men, the training set will contain more "hired" men than "hired" women
- But wait, if humans are already biased, why might this be worse?

Biased Algos Versus Biased Humans



In *Weapons of Math Destruction* Cathy O'neil observes algorithms have a particular tendency to reinforce and increase bias due to three factors:

- 1 Opacity
- 2 Lack of regulation and difficulty of contesting
- 3 Scalability



- Do you feel it's important for individuals to consent to how their data are used?
- Are you concerned about biased ML algorithms?
- Why?

Part II: Ethics Frameworks



- Based on Cathy O'Neill's Book
- Data for Democracy Guidelines
- GDPR
- Others?



- **Opacity:** we must understand why the algorithm is doing what it's doing, no black boxes
- **Lack of regulation and difficulty of contesting:** We must be able to "argue" with a decision made about us, such as to not hire
- **Scalability:** Algorithms have the potential to affect many more people than human decisions (automation), we must ensure we aren't causing a dangerous cycle
 - From WMD: "If a poor student can't get a loan because a lending model deems him too risky (by virtue of his zip code), he's then cut off from the kind of education that could pull him out of poverty, and a vicious spiral ensues."



- For more see <http://ethicspledge.wpengine.com/>
- **Fairness**: understand, mitigate, and communicate the presence of bias
- **Openness**: transparent practices, community engagement, responsible communication
- **Reliability**: understand what is in the data, where it came from, and how it was created
- **Trust**: maximize informed participation
- **Social Benefit**: consider the impact on individuals, communities, and world-at-large



- European Union: General Data Protection Regulation (GDPR)
 - **No Automated Decision Making:** There must be a human in the loop
 - **Right to Explainability:** Many ML models are so complex it's difficult, if not impossible, to explain them. Under GDPR the individuals involved in the data have a right to understand the models.
 - **Legal Basis for Processing Data:**
 - "legitimate interest" e.g., fraud prevention
 - Explicit consent (that's why you got all those e-mails last spring)
- California also passed it's own digital privacy law, similar but not as strict (users must ask for information from companies or to be removed)



- Even if you don't include something, say, race, in your model, other elements like zip code or first name may be indicators of that factor. Is that okay?
- What about manipulations? Do we need to get consent if we show one group of users one version of our website and a different group a different version and measure their behavior?
- Control of algorithms, if I own a self-driving car can I edit its algorithms?



- What are the differences or similarities between these frameworks?
- Do you prefer one?
- Is there anything that you feel is missing or you would add?
- Do you have an alternate framework I missed?

Part III: Ethics Examples



- Bail/Rehab/Parole/Sentencing Algorithms
- Facebook Experiments on People
- Memorial Sloan Kettering



- Increasingly, court systems rely on algorithms for advice on bail, rehabilitation, parole, or sentencing
- In Oct of 2019, California will eliminate cash bail. Instead, an algorithm will recommend if the accused should be released or stay in jail
- In several states, length of sentence may be recommended based on output of an algorithm
- In Ohio (others?) parole versus prison, and length of parole is recommended by an algorithm
- In Rhode Island, the same algorithm is used to determine which of the convicted should receive certain rehabilitative services
- Further Reading:

http://www.abajournal.com/magazine/article/algorithm_bail_sentencing_parole/



- This algorithm does not directly inquire about race, but certain factors (such as social connections) are correlated with race
- This algorithm does include gender
- The exact algorithm is proprietary and unshared
- What do you think, is this an ethical algorithm?
- Does it matter whether the algorithm is being used to determine bail, sentencing, parole, or rehabilitative services?



- Facebook consistently tinkers with what users see, the format of facebook, what's on top in their newsfeed, etc. Some users will be assigned to one group, while others are assigned to a different group
- Facebook then measures behavior in both groups to see if the group assignment affected them



- In 2012 Facebook showed users a message that their friends voted, a reminder to vote, or nothing, and measured effect on voting behavior (confirmed with public voting records). They found an increase of 340,000 votes, for context, Clinton needed to switch 53,650-80,000 (depending on source) votes to win the 2016 election.
- Further Reading (Political Mobilization):

<https://github.com/abbiepopa/BSDS100/blob/master/reading/FB-Bond.pdf>



- Facebook showed some users more "sad" statuses and some users more "happy" statuses in their newsfeed. They found those exposed to sad statuses were more likely to post sad statuses and vice versa
- Further Reading (Emotional Contagion):

<https://github.com/abbiepopa/BSDS100/blob/master/reading/FB-Kramer.pdf>



- If I wanted to try these things, I would have to get approval from an Institutional Review Board and get consent from my participants, should facebook be held to the same standard?
- Does it matter whether the experiment has the potential to have widespread effects (e.g., influencing an election)?



- Memorial Sloan Kettering Cancer Center is one of the largest cancer centers in the U.S.
- Made a deal with for-profit start-up Paige.AI to give them exclusive access to their tissue samples for the purpose of training diagnostic algorithms
- Three board members of Memorial Sloan Kettering also hold large equity stakes in Paige.AI
- Further reading: <https://bit.ly/2QTux29>



- This story is super recent! (Broke Sept 20)
- Conflict of interest (doctors hold a financial stake in one specific for-profit company)
- Patient consent to use their tissue samples for a for-profit venture
- A non-profit giving a for-profit preferential access



- In groups, select your favorite ethics framework and example
- Does the example you chose violate any of the standards in the framework you chose?
- Are there any other reasons it is or is not ethical?
- What are the potential consequences (for individuals or society)?
- What could be done to mitigate the problem? Are there reasons a company might not want to use the mitigation strategy you propose?
- Save your answers in a word document, one file per group, with all group members names at the top of the document. Upload to Canvas.



- To end on a more upbeat note... some are trying to use data for good
- Applying big data techniques to solve social problems
- Example, fighting illegal deforestation:
<https://www.blog.google/technology/ai/fight-against-illegal-deforestation-tensorflow/>
- Getting data tools to non-profits or communities with low access