

Ethical thinking in Data Science

Vandana P. Janeja

University of Maryland,

Baltimore County

Supported by Hrabowski Innovation Fund

PI: V. P. Janeja

- Data Science is sending out the next generation [Data] decision maker, [Data] fire fighters. Any data scientist has to be aware of ethical considerations while using data science to derive knowledge and implement it into decision making.



- **Ethical thinking** must be a critical aspect of any data science project.
- Intertwining commerce and data analytics means use of analyses or availability of records affects communities.
- These considerations should be brought to the forefront, at every point in the data life cycle
 - from data cleaning, selection, mining, thresholding and pattern evaluation, for the students who are the next generation of decision makers.

Principles of Ethical thinking in Data Science

- Ethics is not equal to Privacy. EDS includes privacy, social responsibility, decision making and evaluation of impact in an ethical framework.
- EDS can also include releasing of data not just hiding it. More importantly it includes releasing data responsibly with checks and balances in place.
- EDS means considering all of us and representing all of us in data.
- EDS considers every data scientist touching the data as a data steward, this includes data collectors, data users, data re-users, data re-combiners.
- Ethical context is also heavily influenced and interpreted through a lens of other types of context such as space, time, activity.

Ethics

- Ethics is a complex part of our fabric
- Ethics has been taught since humans started teaching
- Ethics and its implications get morphed with the time we live in
- Ethics takes on different magnitude with ~~the~~ context
- Our ways and behavior evolve as we better understand the ethical implications in context and in the time we live in

Lets do some Web search

Case in point

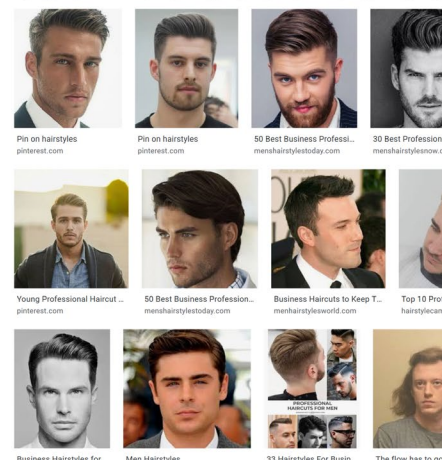
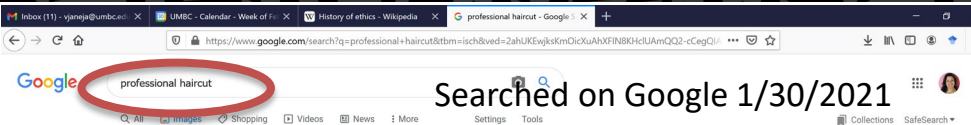
Google

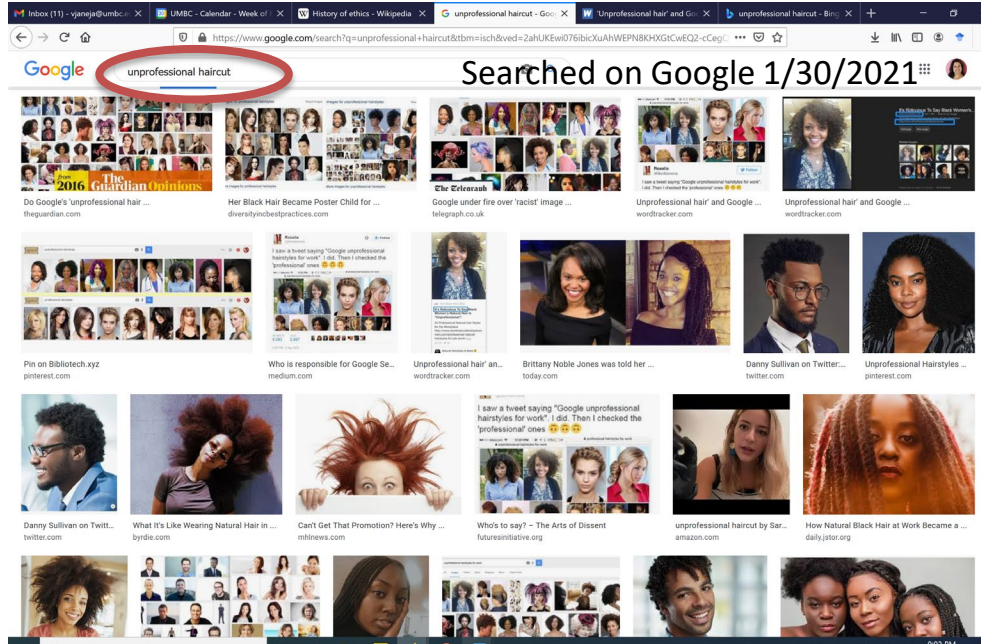
● This article is more than 4 years old

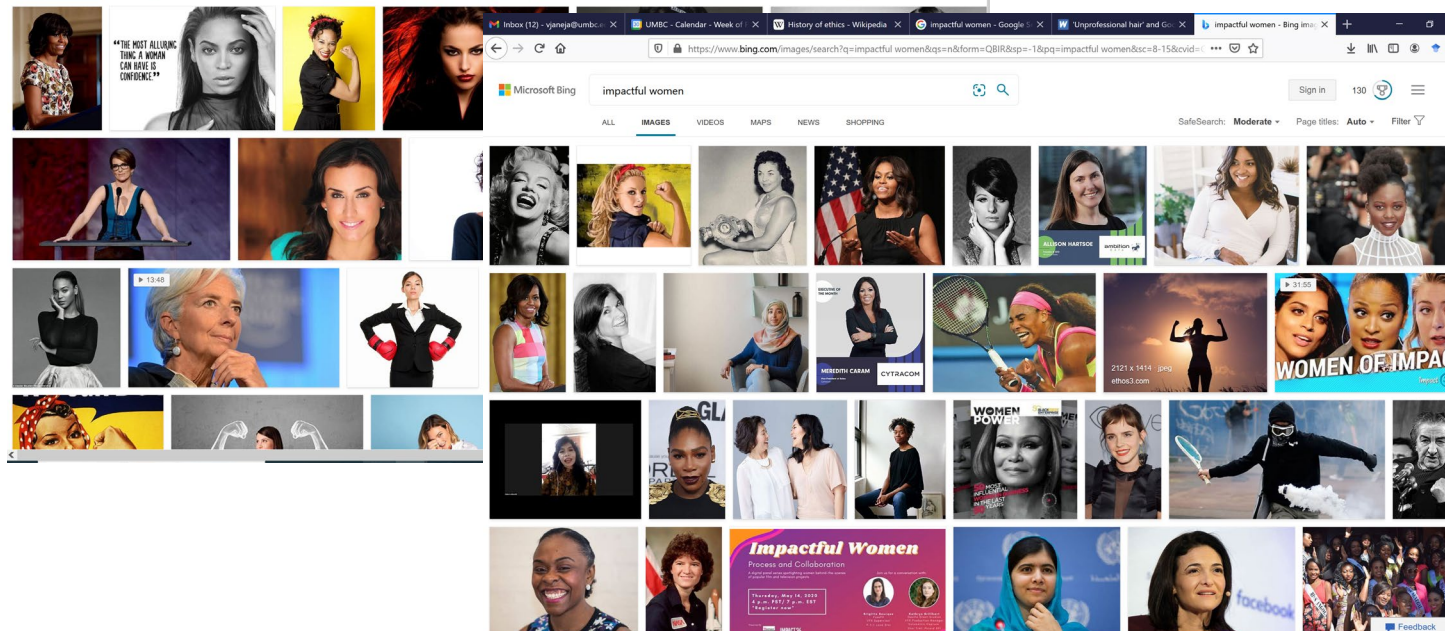
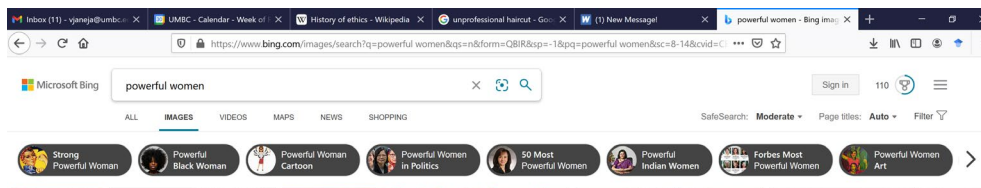
Do Google's 'unprofessional hair' results show it is racist?

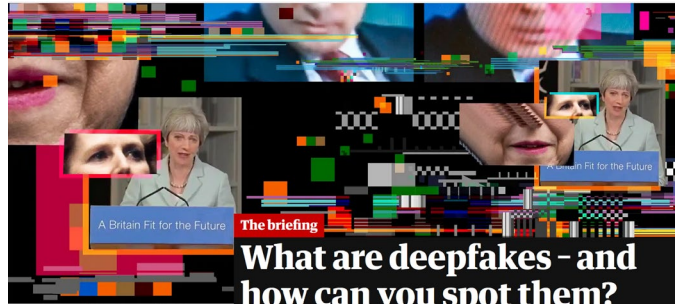
Leigh Alexander

<https://www.theguardian.com/technology/2016/apr/08/does-google-unprofessional-hair-results-prove-algorithms-racist->









<https://www.theguardian.com/technology/2020/jan/13/what-are-deepfakes-and-how-can-you-spot-them>

Mon 13 Jan 2020 05:00 EST
919

technology/facial-recognition-photo-tool.html

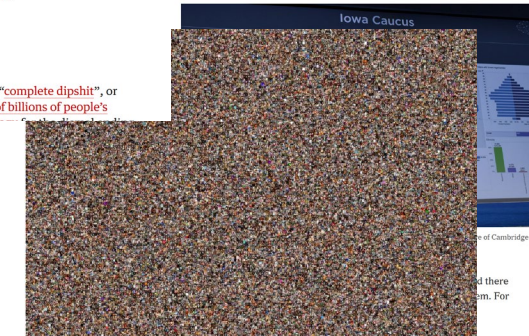
Here's a Way to Learn if Facial Recognition Systems Used Your Photos

An online tool targets only a small slice of what's out there, but may open some eyes to how widely artificial intelligence research fed on personal images.

AI-generated fake videos are becoming more common (and convincing). Here's why we should be worried by [Ian Sample](#)

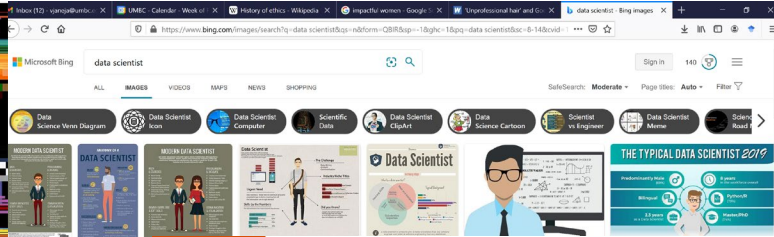
What is a deepfake?

Have you seen Barack Obama call Donald Trump a "complete dipshit", or Mark Zuckerberg brag about having "total control of billions of people's



analytica-trump-campaign.html

"Cambridge Analytica was supposed to be the arsenal of weapons to fight that culture war"



Racially diverse emojis have finally

USA TODAY Network
Apr. 8, 2015 | Updated 3:53 p.m. ET Apr. 9, 2015

2015



from images provided by Apple shows new emojis, the cute graphics that punctuate online writing

om/story/tech/2015/04/08/diverse-emoji-in-

Ethics

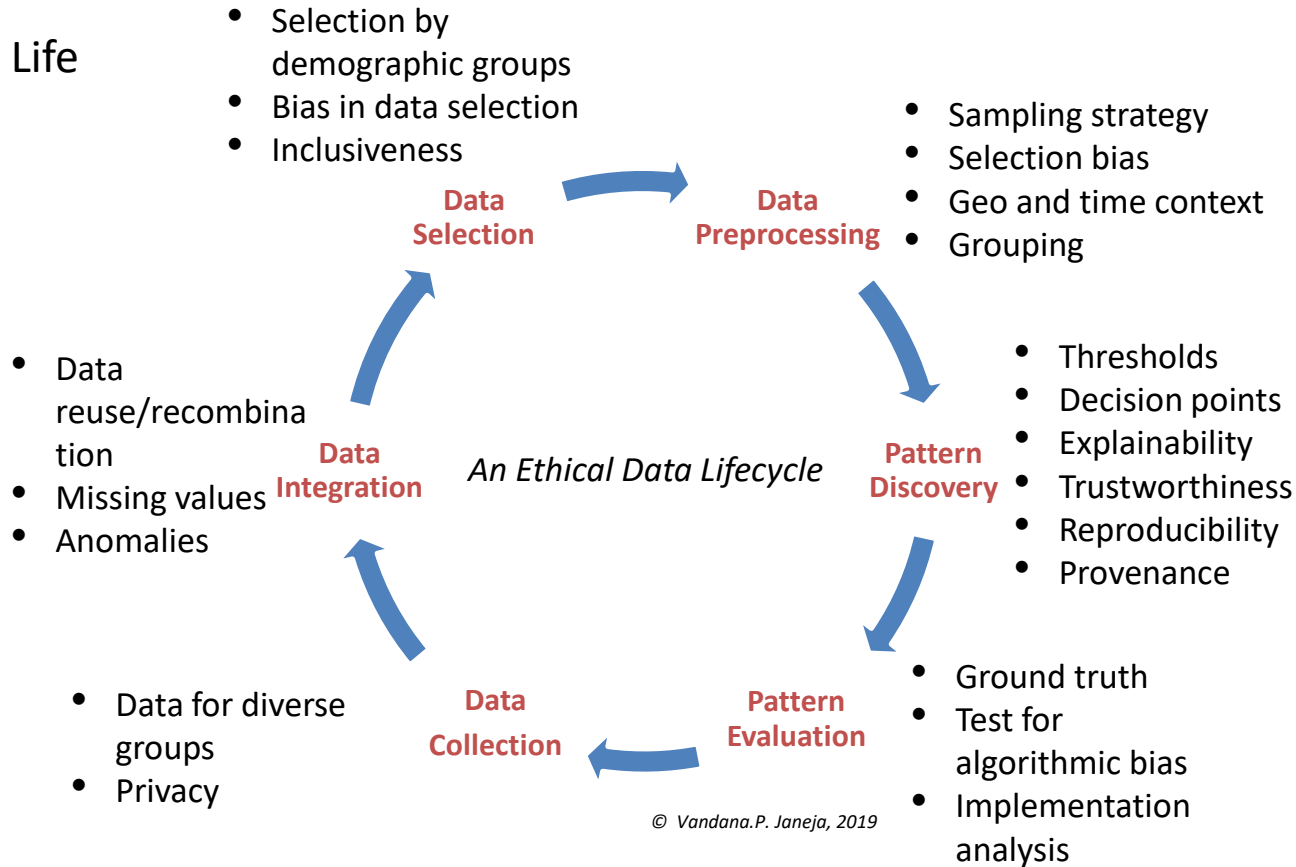
- Ethics is a complex part of our fabric
- Ethics has been taught since humans started teaching
- Ethics and its implications get morphed with the time we live in
- Ethics takes on different magnitude with the context
- Our ways and behavior evolve as we better understand the ethical implications in context and in the time we live in

Everyone needs to address ethics – in today's time and context – especially data scientists and AI experts

Data Life cycle

- Embedding ethical decision making in the data life cycle
- New use of records brings new problems, or difficulty in recognizing existing knowledge
- Data Omission
- Collaboration: learning with what research has demonstrated in other fields (e.g., selection bias)

Ethical Data Life cycle



Case Study Discussion

- **Anomaly Detection: Under the [data] Hood in Smart Cars**
 - Quader, F., & Janeja, V. (2019, June). Anomaly Detection: Under the [data] hood in Smart Cars. In *2019 IEEE International Conference on Smart Computing (SMARTCOMP)* (pp. 126-131). IEEE.
- **Subspace Discovery for Disease Management: A Case Study in Metabolic Syndrome**
 - Namayanja, J., & Janeja, V. P. (2011). Subspace discovery for disease management: A case study in metabolic syndrome. *International Journal of Computational Models and Algorithms in Medicine (IJCMAM)*, 2(1), 38-59.
- **Contact tracing COVID**
 - Student research

Ethical Considerations in Data and Algorithms

Training and Test Distribution in Classification

Data

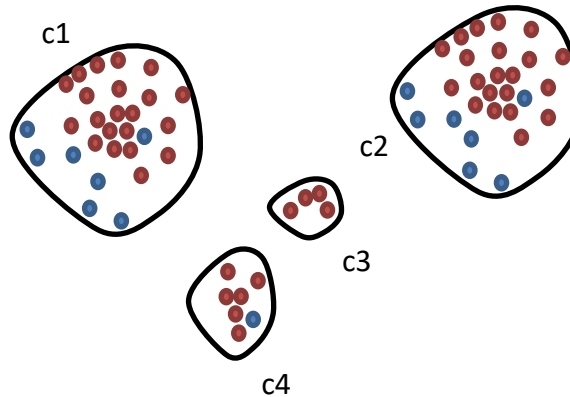
Class	Percent
B	20
W	70
H	10

Sampling Distribution

Class	Percent
B	20
W	70
H	10

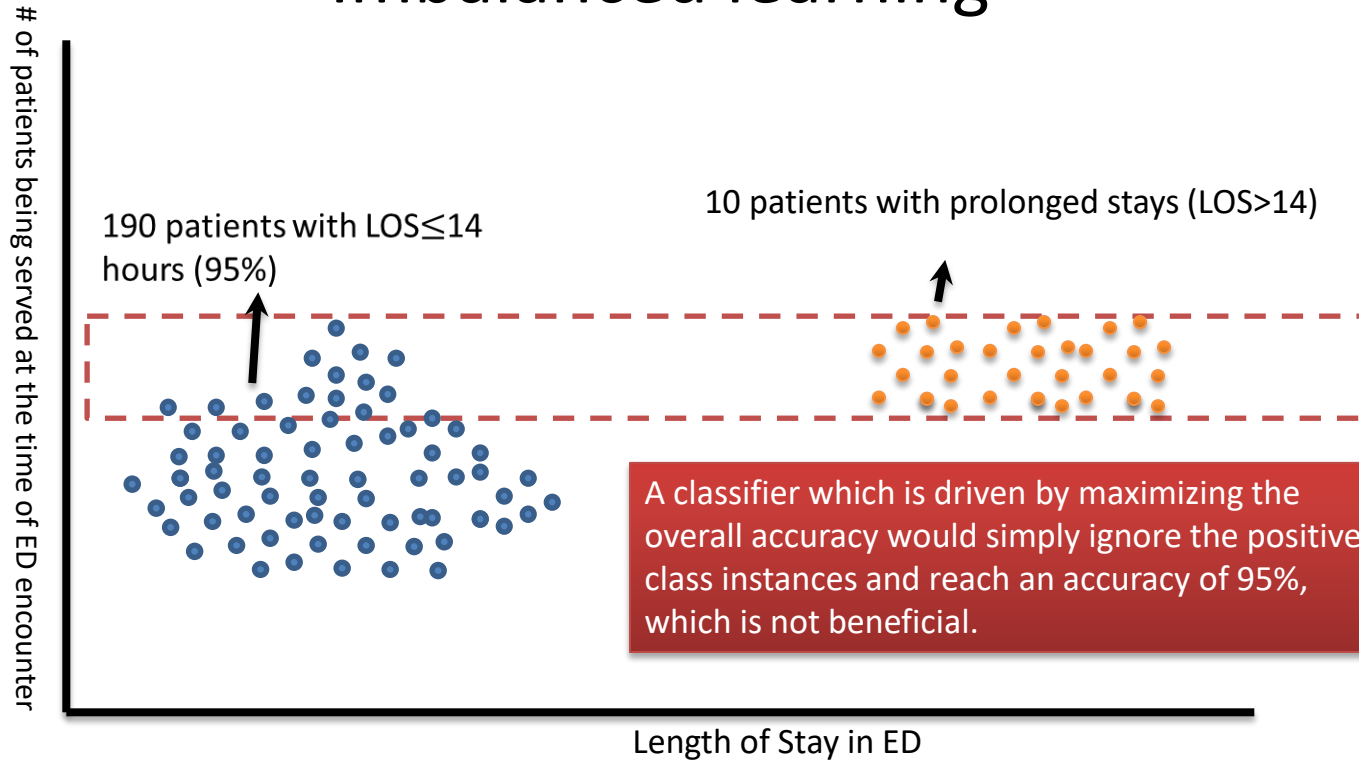
Class	Percent
B	33
W	33
H	33

Clustering and Anomaly Detection



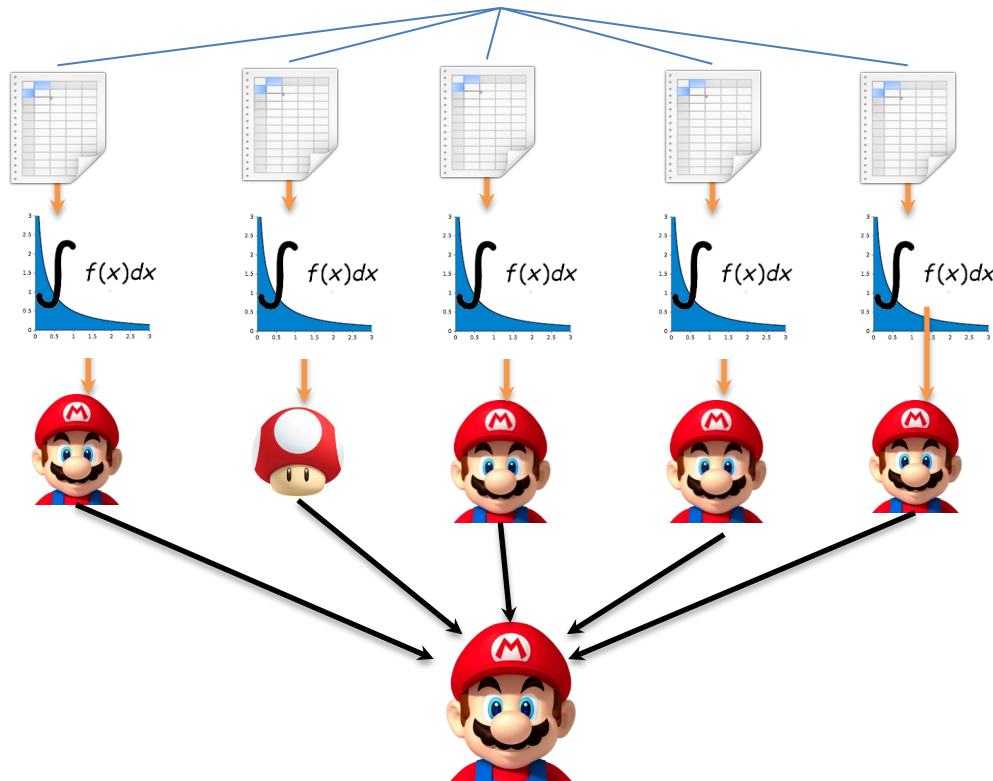
Cluster C3 and C4, Are they anomalies?
Are they minorities?
Should they be rejected or accommodated in the data?

Imbalanced learning



Literature suggests that the **ensemble diversity** can improve the performance of classification on imbalanced data [23], [24].

Ensemble learning



Is AI/Data Science more good than bad?

- Deep fakes
 - Mark Zuckerberg
 - Nancy Pelosi
- Google: detecting breast cancer

Big Data --- Big Debate

- Pro / Cons
 - Summary of case study
 - Pros and Cons
 - Ethical questions (answered/unanswered)
 - Gap
 - What would you do different?