



Patterns of Power: A Crash Course in Algorithms & Society

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Agenda

- Key terms (15 minutes)
- Societal impacts (30 minutes)
- Practical application (30 minutes)
- Questions and discussion (45 minutes)

Key terms

Algorithm (noun)

a step-by-step procedure for solving a problem or
accomplishing some end especially by a computer

(Fry, 2018, p. 7)

Algorithm

- There are two paradigms of algorithms
 - Rule-based algorithms (if, then; step by step)
 - Machine-learning algorithms (AI)

Predictive Model

Uses statistics to predict outcomes

Looks in the past to predict the future

PECOTA Projection System

Uses past performances of the player, and, based on other players similar to him, tries to predict the future performances.

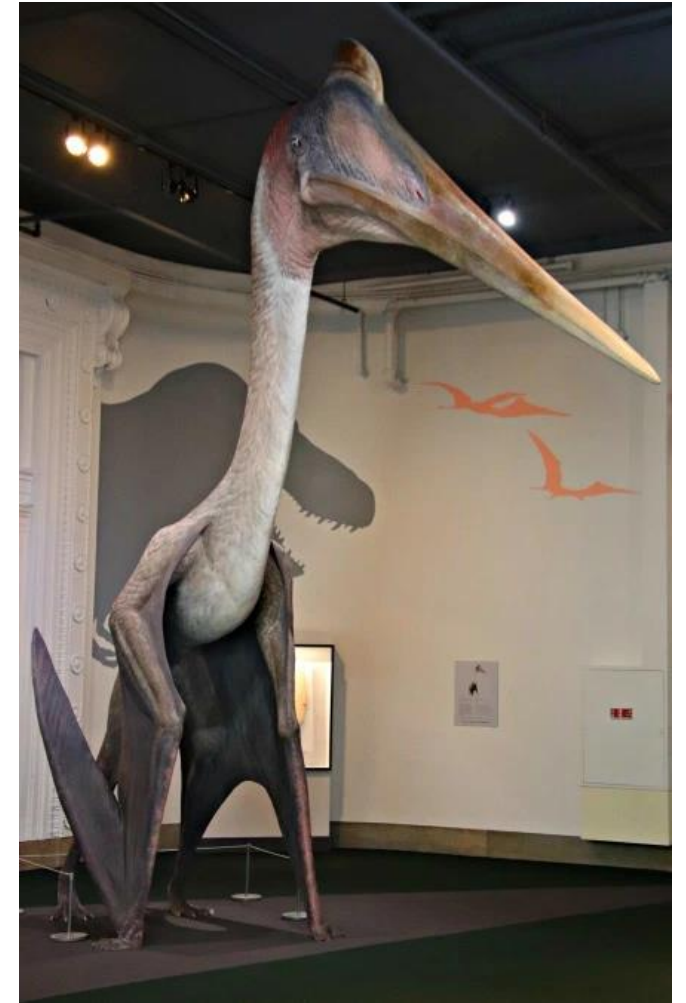


Predictive Model

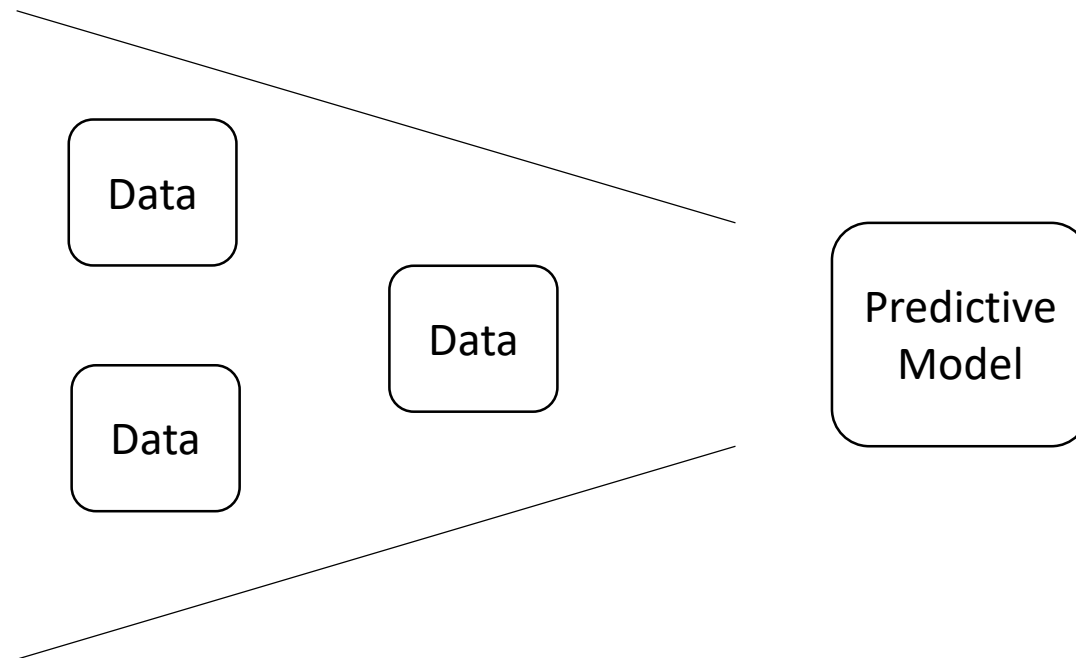
Lets imagine a model to predict if an animal is capable of flying



Predictive Model



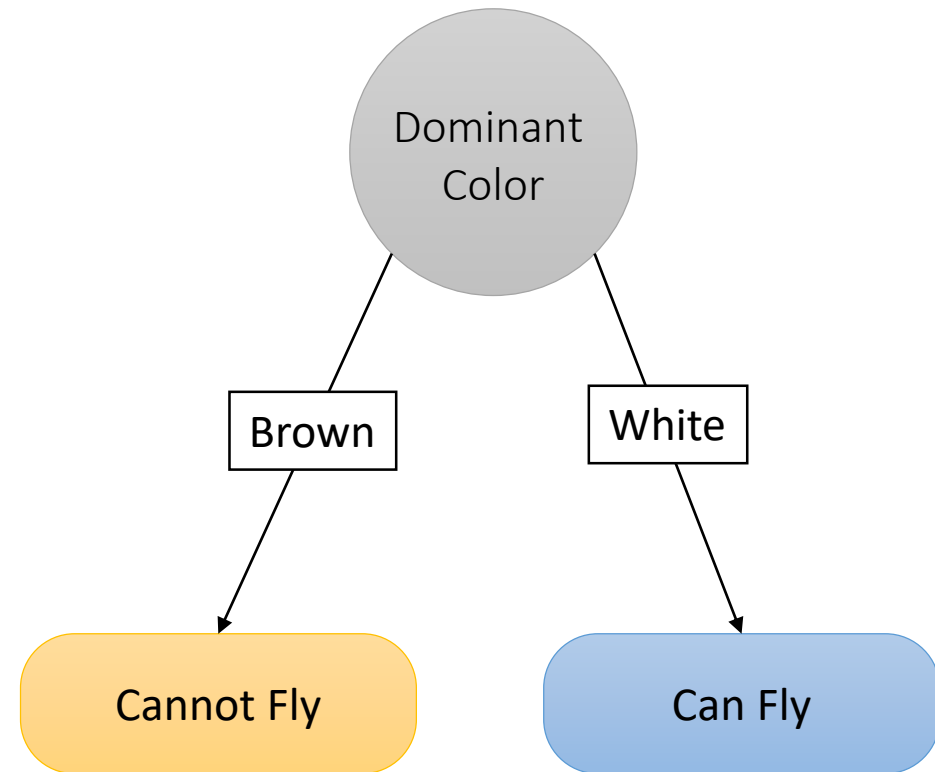
Machine Learning



A machine learning algorithm analyses a corpus of data to derive a predictive model.

This is done by finding patterns in the data that many times are imperceptible to humans.

Machine Learning

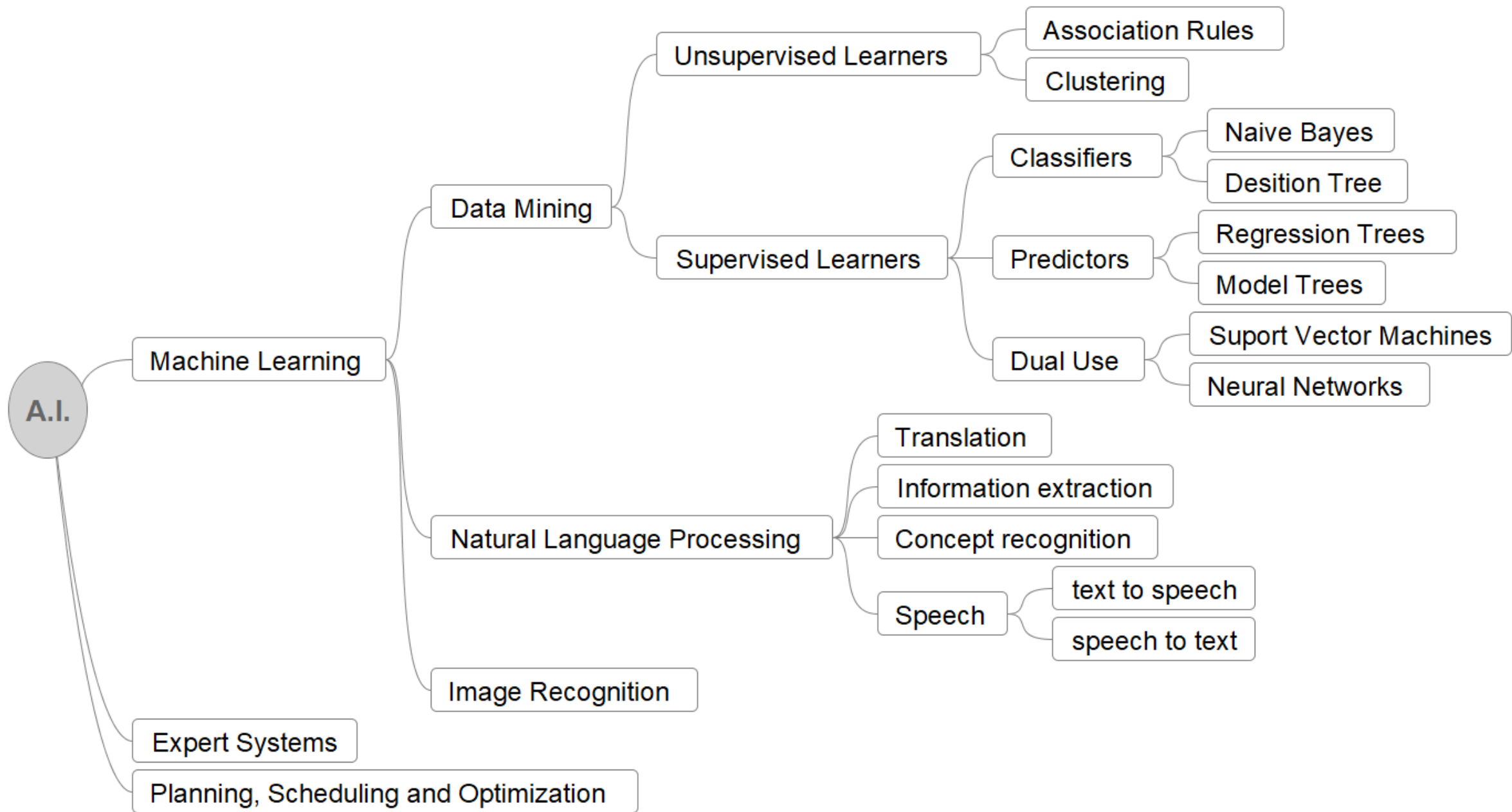


Artificial Intelligence

**“the quest to build machines that can reason, learn,
and act intelligently” (Artificial Intelligence, 2019)**



(MIT Technology Review, 2019)



What is bias?

“1a : an inclination of [temperament](#) or outlook *especially* : a personal and sometimes unreasoned judgment : [prejudice](#)

b : an instance of such prejudice

c : [bent](#), [tendency](#)

d(1) : deviation of the expected value of a statistical estimate from the quantity it estimates

(2) : systematic error introduced into sampling or testing by selecting or encouraging one outcome or answer over others”

(Merriam-Webster, 2019)

What happens when one of these definitions leads to another?

What happens when we use history to define the future?

“These are not mistakes they are making.
These are something called choices,
choices about what is important to them,
about what priorities they have”

(Wachter-Boettcher, 2018)

“When we take information from the past and use it without thinking about it and use it in the future...we reinforce all kinds of biases”



(Wachter-Boettcher, 2018)



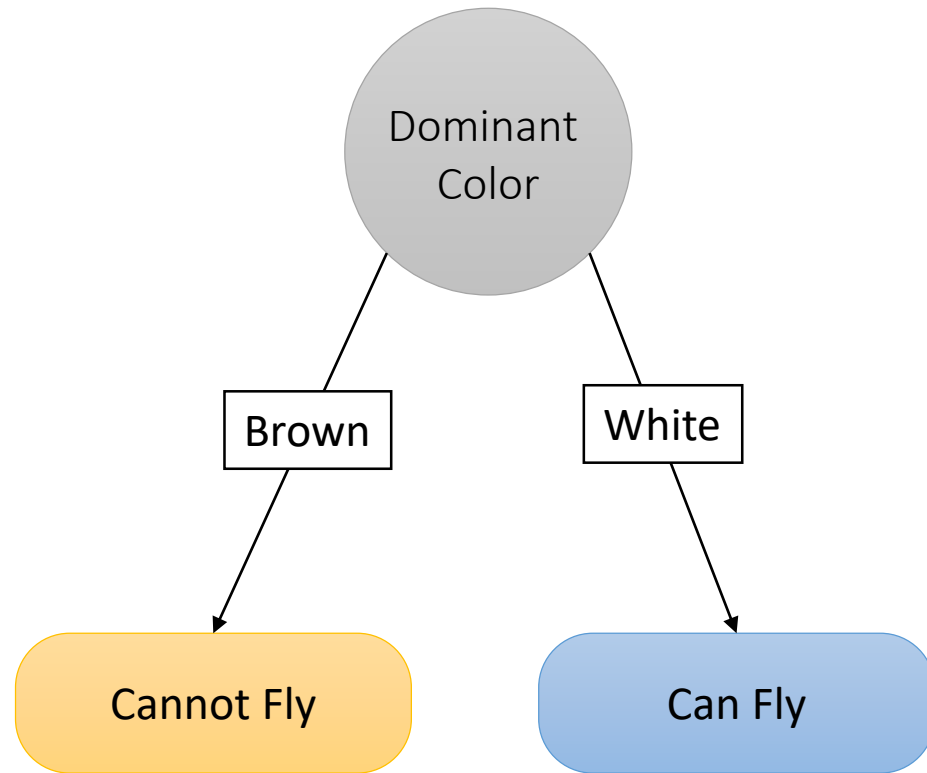
Algorithmic bias

“The term algorithmic bias describes systematic and repeatable errors that create unfair outcomes, such as privileging one arbitrary group of users over others.”

https://en.wikipedia.org/wiki/Algorithmic_bias



Algorithmic bias



Algorithmic bias

- By the programmers
- By Design
- Not representative training data
- False Correlations
- Feedback loop

How is introduced ?

The image shows a screenshot of a Facebook post from 'EBHnow - Instant Evidence Based Healthcare' published by Mohamed Nur Abdallah on December 30, 2018. The post is titled '3rd Molar:Exo-or-Not© summarizes the guidelines for extraction of third molars according to the American Dental Association and the National Institute for Health and Care Excellence'. It includes a link to an application and a button 'Click here to start'. A blue banner below the link states: 'This application is based on the guidelines of American Dental Association, The National Institute for Health and Care Excellence (NICE) and The Canadian Agency for Drugs and Technologies in Health'. A small disclaimer at the bottom of the post reads: 'This application was built by Dr. Zaher Jabbour, Dr. Haider Al-Wakeel and Dr. Faleh Tameer, McGill University. These data are not intended to, and do not, express, imply, or summarize standards of care, but rather provide a concise reference for dentists to aid in understanding and applying evidence from the referenced published guideline in making clinically sound decisions as guided by their clinical judgment and by patient needs. EBHnow.com © is not responsible for any clinical decision made with the data presented.' Below the post, the URL 'HTTP://EBHNOW.COM/WP/APPLICATIONS/THIRD-MOLAR-...' is visible.

Overlaid on the right side of the post is a Facebook 'Boost Post' warning. The warning text reads: 'This ad isn't running because it makes false, misleading, or deceptive claims. All information needs to be accurate for all people (ex. "Lose 5 lbs in a week running" isn't suitable because this claim can't be true for everyone). Ads should clearly and accurately reflect the product or service being advertised in order to maintain a positive experience for our users. To learn more and see examples, check out our Advertising Policies.' Below this text, it says 'What to do next: Avoid using images or text that make exaggerated or unverified claims, and instead, clearly focus on the product or service being offered.' At the bottom of the warning is a button labeled 'Request Review'.

Societal impact



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AMERICA

Uber Ends Its Controversial Post-Ride Tracking Of Users' Location

August 29, 2017 · 5:41 PM ET



LAUREL WAMSLEY



Allowing Uber to always track one's location didn't seem great either, given that this was the same company that announced in 2012 it had scoured user data and [calculated the prevalence of one-night stands](#).

It's all fun and games until...

Politics

Amazon Pitches Facial Recognition to Monitor Immigrants

By Spencer Soper

October 23, 2018, 4:53 PM EDT *Updated on October 23, 2018, 7:56 PM EDT*

- ▶ Company officials met with U.S. ICE to discuss technology
- ▶ Critics say artificial intelligence in surveillance is risky



<https://www.bloomberg.com/news/articles/2018-10-23/amazon-pitches-facial-recognition-tools-to-monitor-immigrants>

ICE Used Facial Recognition to Mine State Driver's License Databases



Vermont is one of at least three states where Immigration and Customs Enforcement officials asked to comb through driver's license photos. Toby Talbot/Associated Press

By **Catie Edmondson**

July 7, 2019



WASHINGTON — Immigration and Customs Enforcement officials have mined state driver's license databases using facial recognition technology, analyzing millions of motorists' photos



EXCLUSIVE ENTERTAINMENT

Netflix Plays New Role: Budget-Conscious

By [Jessica Toonkel](#), [Tom Dotan](#) and [Beejoli Shah](#) Jul 01, 2019 7:01 AM PDT · [Comment by Martha Josephson](#)

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In early June, Netflix content chief Ted Sarandos met with several dozen of his middle-ranking and senior film and TV executives and delivered a blunt message: Be more careful with money.

Mr. Sarandos told the group that spending on film and TV projects, particularly big budget movies, needed to be more cost-effective, according to people familiar with the meeting. Netflix has long measured the efficiency of its TV shows and movies using a ratio of their cost to a measure of viewership that gives more weight to new subscribers and those viewed at risk of canceling, say former employees. Mr. Sarandos made clear that in the future big-budget projects should bring in lots of viewers, a shift from the past when they might have gotten a pass if they were expected to get buzz and build



The stars of Netflix's "Triple Frontier" movie at a premiere screening in Madrid. Photo by AP

<https://www.theinformation.com/articles/netflix-plays-new-role-budget-conscious>



Safe
Appropriate

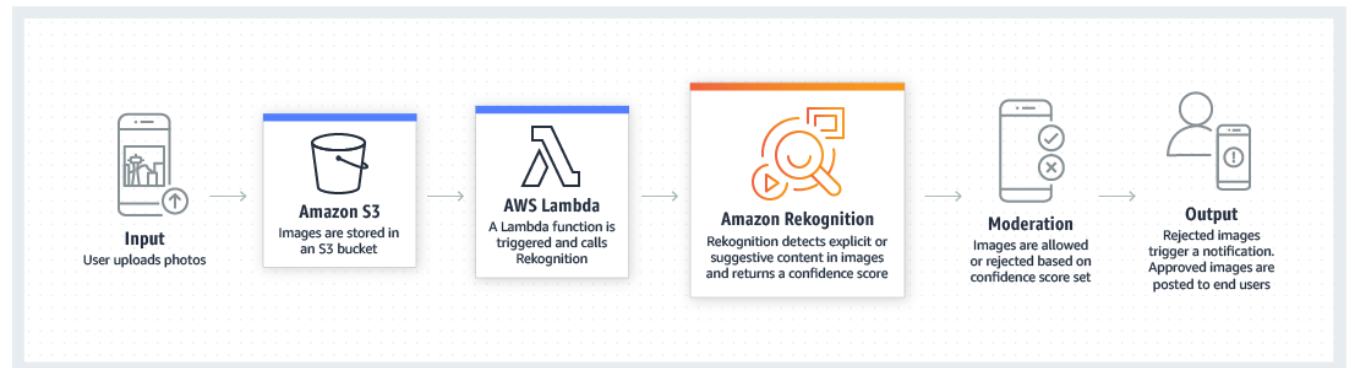
Unsafe content detection

Amazon Rekognition helps you identify potentially unsafe or inappropriate content across both image and video assets and provides you with detailed labels that allow you to accurately control what you want to allow based on your needs.

Image moderation

Amazon Rekognition allows you to automatically detect inappropriate content in images using the Image Moderation API. The API returns a confidence score for a detailed set of content categories, which allows you to create your own rules around what is appropriate for the culture and demographics of your users. [Get started »](#)

Example: Moderating user uploaded images



<https://aws.amazon.com/rekognition/>



Facial analysis

You can analyze the attributes of faces in images and videos you provide to determine things like happiness, age range, eyes open, glasses, facial hair, etc. In video, you can also measure how these things change over time, such as constructing a timeline of the emotions of an actor.

<https://aws.amazon.com/rekognition/>

Sentiment analysis

Amazon Rekognition can detect emotions like happy, sad, or surprised from facial images. Rekognition can analyze live images, and send the emotion attributes to Redshift for periodic reporting on trends for each store location.

Example: Retail store sentiment analysis



Face-based user verification

With Amazon Rekognition, your applications can confirm user identities by comparing their live image with a reference image.

Example: Employee badge scan






ARMED™ is dedicated to the development and integration of cutting-edge technology to combat acts of political violence, terrorism, organized criminal activities, and insider threats.



Uluru leverages the cloud to make parents' and teachers' lives easier. Specifically, their "En Photo" offering reduces the effort required to identify photos of kindergarteners and other schoolchildren so parents can purchase these photos.

A woman wearing a green hijab is shown in profile, looking towards a white humanoid robot. The robot has a smooth, white face and body, with blue eyes and a slight smile. The background is a simple, light-colored wall.

**Tengai
Unbiased**

<https://www.tengai-unbiased.com>

“...neutrality is impossible. In any situation, there exists a distribution of power. “

-The Myth of the Neutral Profession by Robert Jensen



Fairness, Accountability, and Transparency in Machine Learning

Bringing together a growing community of researchers and practitioners concerned with fairness, accountability, and transparency in machine learning

The past few years have seen growing recognition that machine learning raises novel challenges for ensuring non-discrimination, due process, and understandability in decision-making. In particular, policymakers, regulators, and advocates have expressed fears about the potentially discriminatory impact of machine learning, with many calling for further technical research into the dangers of inadvertently encoding bias into automated decisions.

At the same time, there is increasing alarm that the complexity of machine learning may reduce the justification for consequential decisions to “the algorithm made me do it.”

The annual event provides researchers with a venue to explore how to characterize and address these issues with computationally rigorous methods.

Technology

IBM launches tool aimed at detecting AI bias

By Zoe Kleinman
Technology reporter, BBC News

🕒 19 September 2018



GETTY IMAGES

Algorithms and machine-learning could increasingly be used to calculate things like car insurance

Top Stories

US gangster 'Whitey' Bulger found dead

James 'Whitey' Bulger, the Boston gangster whose life inspired films, was reportedly killed in jail.

🕒 26 minutes ago

Synagogue shooting victims' funerals start

🕒 21 minutes ago

A woman trying to make history

🕒 7 hours ago

Features



Some truths about Trump's birthright plan

Gender Shades

The Coded Gaze

AI, Ain't I A Woman



Fight Bias

Newsletter

GET INVOLVED

<https://www.ajlunited.org>

ALGORITHMIC JUSTICE LEAGUE



The European Commission's

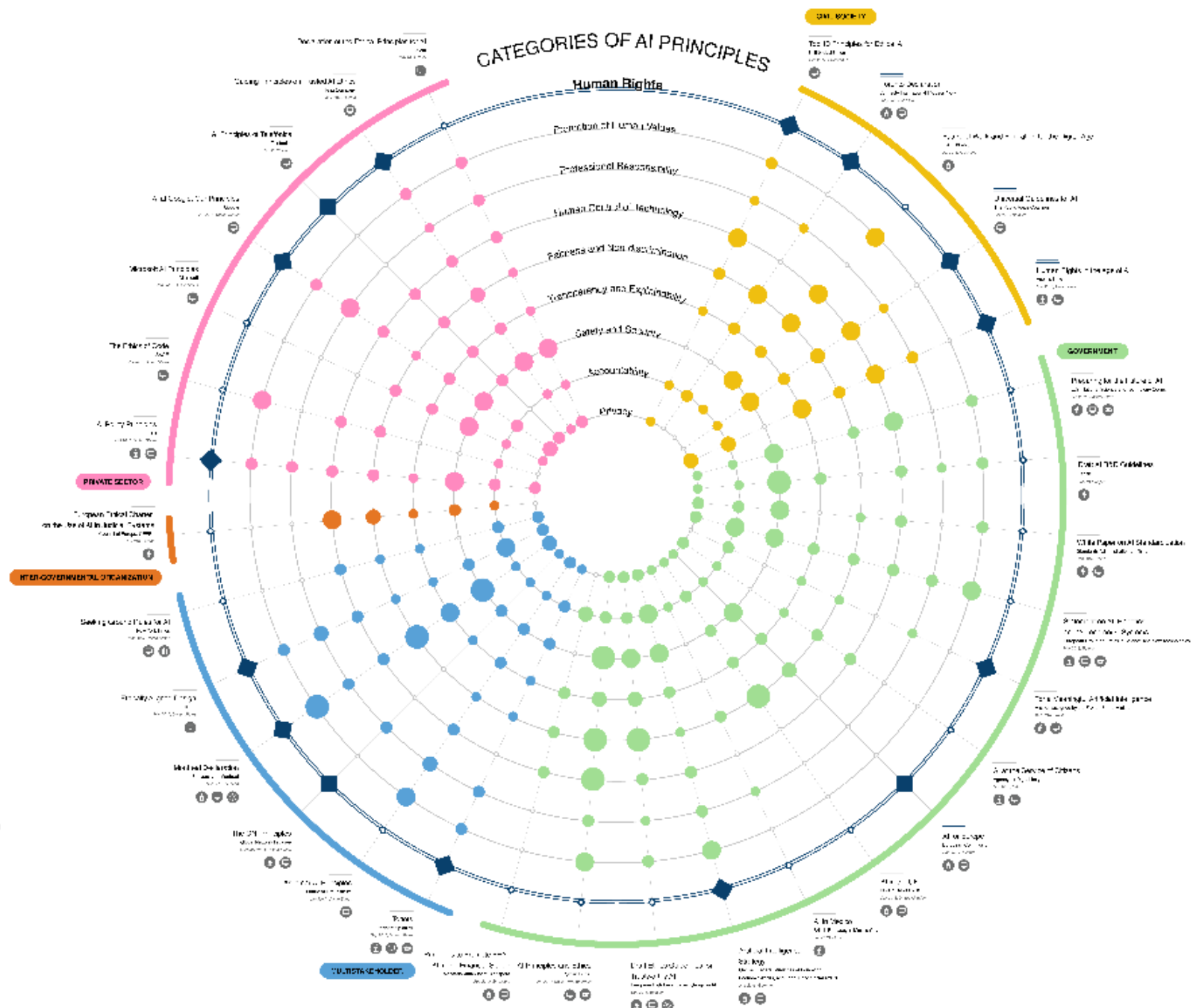
HIGH-LEVEL EXPERT GROUP ON ARTIFICIAL INTELLIGENCE



DRAFT

ETHICS GUIDELINES FOR TRUSTWORTHY AI

CATEGORIES OF AI PRINCIPLES



Practical application

Text Mining

Overall Process

1. Data Gathering
2. Pre processing
 - Getting the data ready
 - Attribute Generation
 - Attribute Selection
3. Data Mining
4. Interpretation and evaluation

Text Mining

<https://github.com/fberrizbeitia/ai-workshop-2019>

Experiments

- Create, save and evaluate the following models:
 - Female only data
 - Male only data
 - Both gender data
- Compare the results of each model using different gender test set

Discussion

Hacker ~~Ethic~~ Questions

- ~~Access to computers should be unlimited and total.~~ Who gets to use what I make? Who am I leaving out? How does what I make facilitate or hinder access?
- ~~All information should be free.~~ What data am I using? Whose labor produced it and what biases and assumptions are built into it? Why choose this particular phenomenon for digitization/transcription? What do the data leave out?
- ~~Mistrust authority—promote decentralization.~~ What systems of authority am I enacting through what I make? What systems of support do I rely on? How does what I make support other people?
- ~~Hackers should be judged by their hacking, not bogus criteria such as degrees, age, race or position.~~ What kind of community am I assuming? What community do I invite through what I make? How are my own personal values reflected in what I make?

Activity

- What industry are you working/studying in?
- Does that industry have a code of ethics, collective principles, best practices, etc?
- Based on your industry, propose an action plan for those in your field to uphold these principles while engaging with technology.
- Consider how the actions may change as technology continues to advance, but remain centred on the principles you choose
 - Example:
 - If you were an engineer building a system for a tech company, how would the selected principles inform your work? How would your knowledge re: technological advances influence your practice?
 - How would this be different if you were high school teacher? A psychologist? An accountant?

Learn More

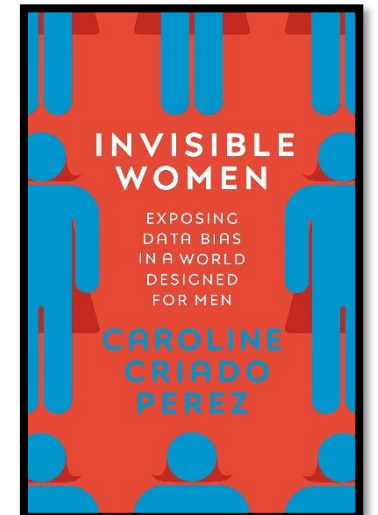
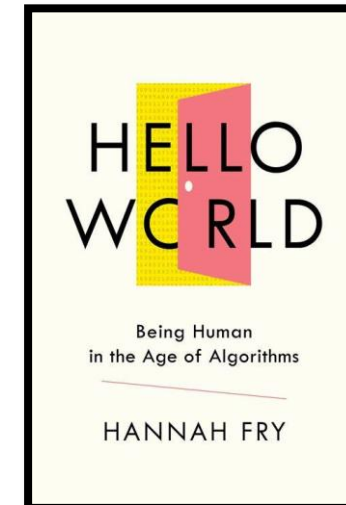
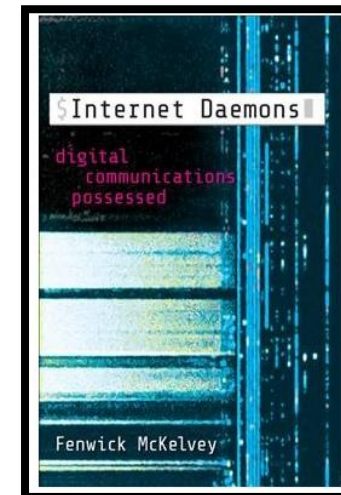
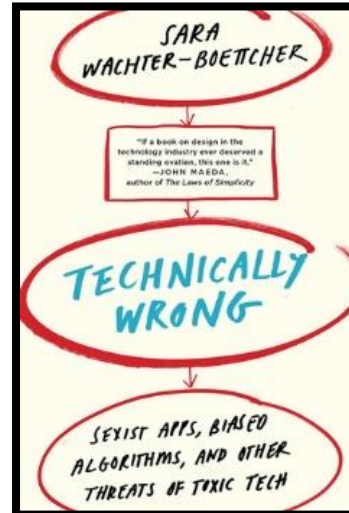
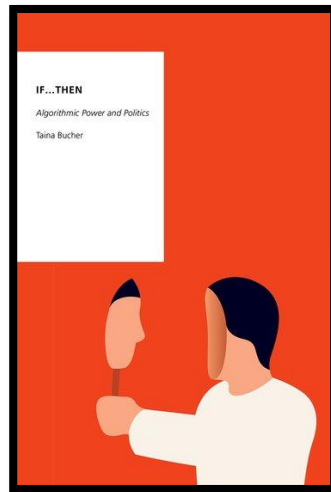
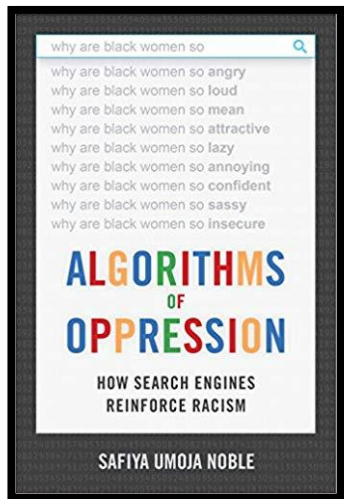
Participate

- Algorithmic Media Observatory
- Montreal AI Ethics Institute

Watch

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Read



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Thank you for coming