# The Importance of Data Ethics

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Donna LaLonde
Fall Technical Conference 2021



# We want to hear your voice

### menti.com





Please enter the code

1234 5678

Submit

The code is found on the screen in front of you

# What is your location right now?

Raleigh, NC

Haddonfield, NJ

San Antonio, TX

Fredericksburg Virginia

NC

Salt Lake City, Utah

Washington, DC

Schenectady, NY

VA



# What is your location right now?

Brookville, Pennsylvania

Raleigh, NC

Tampa, Fl

Pensacola, FL

Round Lake, IL

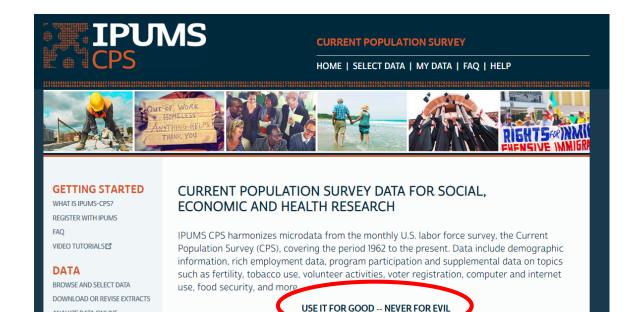
Tampa

Longmont CO

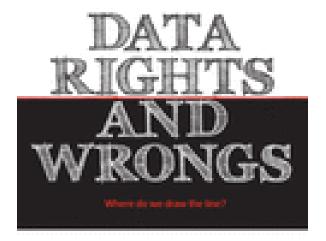
South Africa

Boston, MA









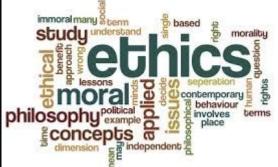


Introne Roods

Ovic arithmetic



ANALYZE DATA ONLINE



Home About Peace-Work Data For Good Peace-Work Studies Blog www.peace-work.org f y in

Statisticians, Data Scientists, and others...

...using our analytic skills...

#### Data For Good

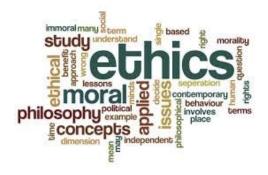
...on volunteer projects...

...to help people and a make better world

# Stories and Issues

To get us thinking ....

### Medical



Models developed to predict what patients might benefit from preventive medical care

Excluded race, but used future cost to health system to predict & rank

Cost is not race-neutral – minority patients have fewer costs than white patients with same conditions

- Less medical insurance
- Fewer options for care

Underestimates health needs of sickest minority patients

Mapping highest scores showed concentration in affluent suburbs

## Hiring



Amazon constructed experimental tools to score resumes – one to five stars

Realized ratings were not gender-neutral

Models were trained using data from previous 10year period – reflecting male dominance in tech



### **Criminal Justice**

### Glenn Rodriquez – flagged as "high risk" based on **trade secret algorithm** and refused parole

- Arrested at 16 and convicted of 2<sup>nd</sup> degree murder
- 26 years later ... 0 disciplinary actions
- 4 years trained service dogs for wounded veterans
- 11 years youth volunteer
- "Question 19"

#### Predictive policing software

- Focus on already hotspot areas
- Add police increase in reports
- Resulting spike used as justification







Face scanning algorithm analyses candidates' facial movements, word choice, speaking voice to assess

Gives them an employability score

Proprietary tool – **unable to ask machine** what they did wrong or how to improve

Company did not know how the algorithm worked

## Training Data

What about **training data**?

Amazon Alexa and other smart speakers are common.

Conversations & sounds are recorded.

Humans listen, transcribe, and annotate to create training data.

What about cameras?

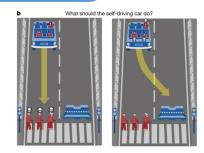
https://www.bloomberg.com/news/articles/20 19-04-10/is-anyone-listening-to-you-on-alexa-aglobal-team-reviews-audio



### **Driverless Cars**

### Autonomous vehicles - what should vehicle algorithms do?

- Assume accident is unavoidable
- Minimize damage to car?
- Save car passengers?
- Save pedestrians?



#### The Moral Machine

http://moralmachine.mit.edu/

https://www.nature.com/articles/d41586-018-07135-0 https://www.nature.com/articles/s41586-018-0637-6 /code-of-silence/

### Moral Machine

Thirteen (13) scenarios where someone would die

#### Mix of situations -

- Young or old
- Rich or poor
- More people or fewer

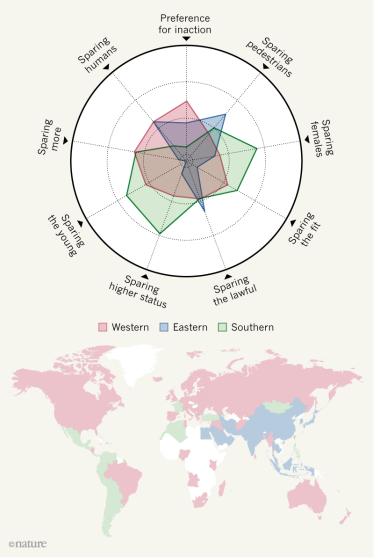
For the most part... regardless of age, gender or country most

- Spared humans over pets
- Groups of people over individuals

https://www.nature.com/articles/d41586-018-07135-0 https://www.nature.com/articles/s41586-018-0637-6

#### MORAL COMPASS

A survey of 2.3 million people worldwide reveals variations in the moral principles that guide drivers' decisions. Respondents were presented with 13 scenarios, in which a collision that killed some combination of passengers and pedestrians was unavoidable, and asked to decide who they would spare. Scientists used these data to group countries and territories into three groups based on their moral attitudes.



### Moral Machine

#### Western

- Preference for inaction
- No dips or major peaks

#### Eastern

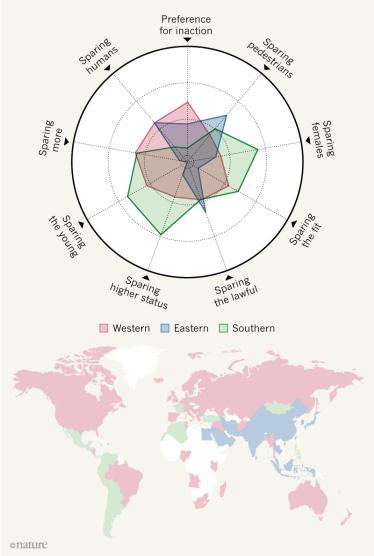
- Sparing pedestrians
- Sparing the lawful
- Dip young and fit

#### Southern

- Sparing females
- Spring the fit & young
- Sparing higher status
- Dip inaction and lawful

#### MORAL COMPASS

A survey of 2.3 million people worldwide reveals variations in the moral principles that guide drivers' decisions. Respondents were presented with 13 scenarios, in which a collision that killed some combination of passengers and pedestrians was unavoidable, and asked to decide who they would spare. Scientists used these data to group countries and territories into three groups based on their moral attitudes.



https://www.nature.com/articles/d41586-018-07135-0 https://www.nature.com/articles/s41586-018-0637-6

# What would you do?

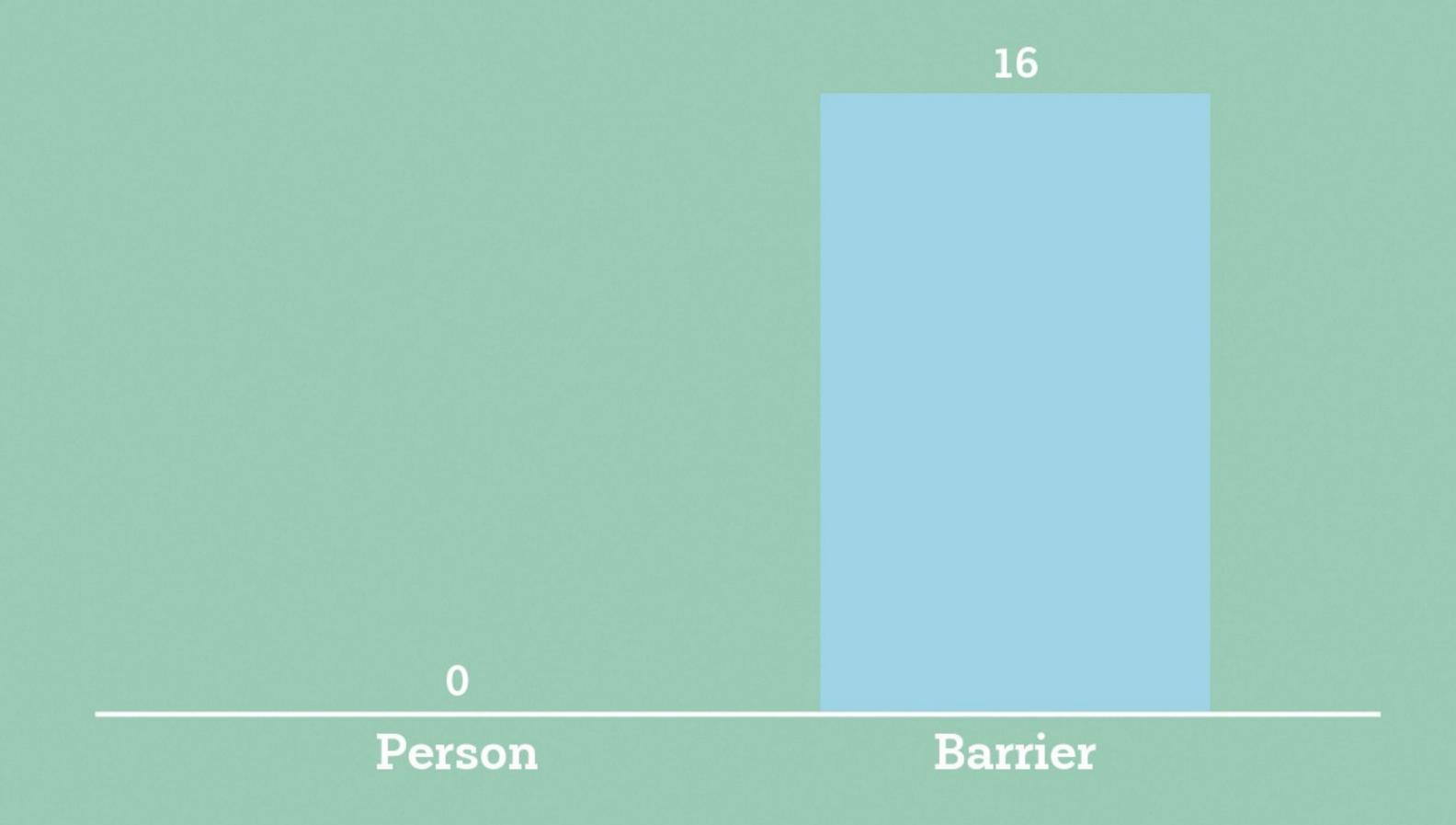
Given the previous scenario with a driverless car – what is your decision?

- Hit the people
- Hit the barrier

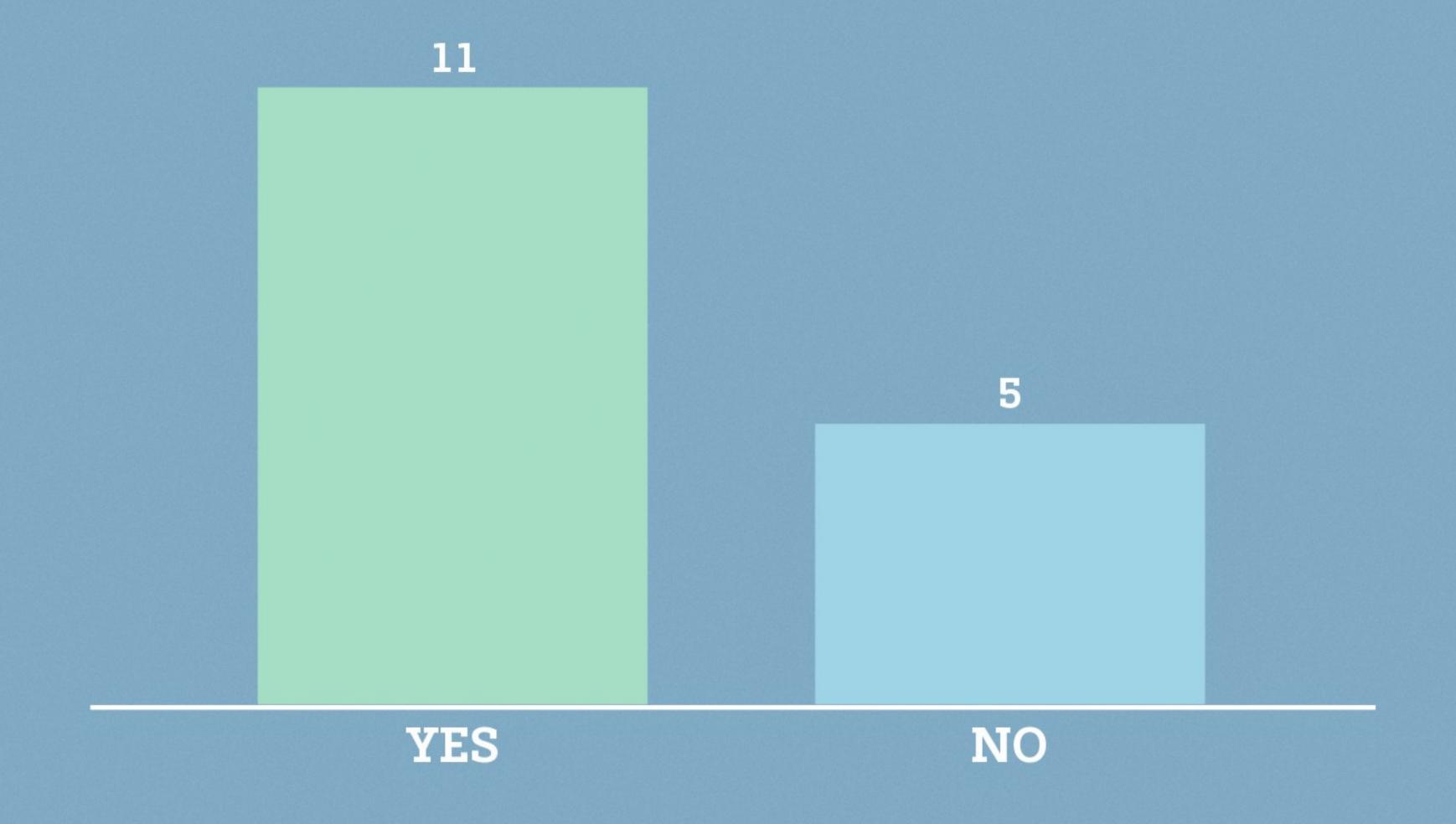
Would you ride in a driverless car?

Go to <u>www.menti.com</u> and enter the code.

# What would you have a driverless car do - hit person or barrier?



# Would you ride in a driverless car?



### What is data ethics?

So we have a common understanding...

# What is Data Ethics?

Is the study of right and wrong

Is the set of moral principles governing our behavior

Is often abstract — guidelines

Ethics ...

Data Ethics builds on 30 years of computer ethics then ... information ethics.

Data are foundational... lowest abstraction.

Related areas: Data Science Ethics, Ethics in AI, Big Data Ethics

### Three Axes of Data Ethics

#### **Ethics of Data** – Collection of large datasets

- Re-identification of individuals, Privacy
- Trust and transparency
- Web-scraping

<u>Ethics of Algorithms</u> – Increasing complexity and autonomy of algorithms (e.g., Internet of Things)

- Machine learning
- AI, robots

<u>Ethics of Practices</u> – Responsible innovation, R&D, usage – foster innovation and protect rights

- Informed consent, Confidentiality
- Hacking
- Secondary use integration of data sets

https://royalsocietypublishing.org/doi/full/10.1098/rsta.2016.0360 https://www.dataversity.net/what-are-data-ethics/

# Another definition ...

- From United Kingdom *Data Ethics* Framework:
  - Data ethics is an emerging branch of applied ethics which describes the value judgements and approaches we make when generating, analyzing and disseminating data.
- Includes/requires
  - Knowledge of data protection law and legislation
  - Appropriate use of technology
- Holistic approach good practices in computing, ethics and information assurance

https://www.gov.uk/government/publications/data-ethics-framework/data-ethics-framework

# Another definition ...

http://raw.rutgers.edu/doc s/wcars/38wcars/Presentat ions/Dan%20-%20Ethics%20for%20Big% 20Data%20and%20Analyti cs.pdf  According to Daniel E. O'Leary, University of Southern California (Ethics for Big Data and Analytics, 2016):

Big data ethics as the analysis of the nature and societal impact of big data technology and the corresponding formulation and of policies for ethical use of big data.

- Discusses how big data ethics differ from general ethics and computer ethics
  - Different emerging codes of ethics
  - Lack of specificity in existing computer/general ethical frameworks

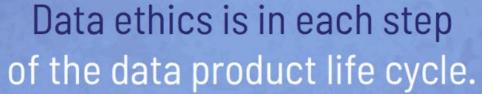
## Another definition ...

http://magnacartafordata
.org/data-ethics-is-aboutanticipation/

 According to the Data Ethics Ireland Community:

Data ethics, as the set of principles and methods through which the ethical implications of applications of data processing and analysis (Data Science) are considered and resolved... It is about understanding complicated, hard to predict social phenomena emerging from complicated hardly understood technologies.

- Ethical implications are potentially infinite.
- Awareness of ethical implications have to be anticipatory – what if.





https://weallcount.com/the-data-process/

How would YOU define data ethics?

Go to www.menti.com and use the code.

## What is your definition of data ethics?

Use the right data for the right reasons to make the right decisions

say what you will do with the data and then do only that.

Principles regarding the moral and social impacts surrounding data collection and analysis.

evaluate moral problems associated with data

The proper use of data that maximise the benefit for the society.

being fair and unbiased in how information represented by data is used and shared

A framework for responsible use of data without doing damage to data subjects and promotion of access to data.

A willingness to use data only for agreedupon goods for society.

Accountability

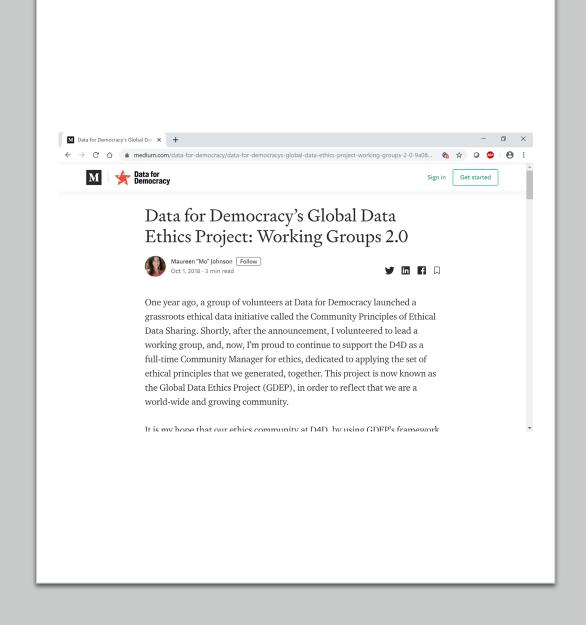


# What are we doing now?

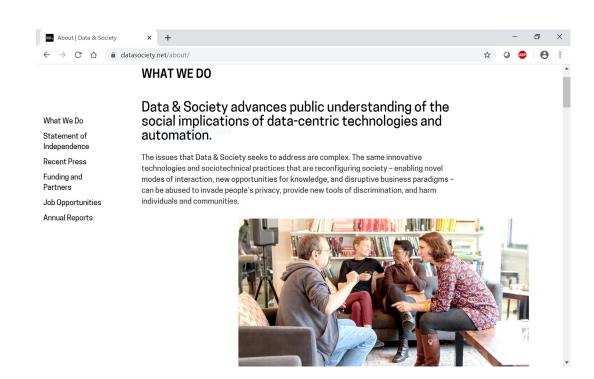
Data Ethics
Organizations:
Principles

# Data for Democracy

- Data for Democracy Global Data Ethics Project
- FORTS Fairness,
   Openness, Reliability,
   Trust, and Social Benefit
- https://github.com/Data 4Democracy



### Data & Society



#### DataEthics.eu

#### Tools for Data Ethics

Download this newly updated dataethicsreadiness-test-2021

White Paper on Data Ethics in Public Procurement of Al-Based Services

**Principles of Data Ethics** - Or get it print on demand



Data Ethics Tools for companies

**Digital Selfdense Tools** for individuals

**Ethical Software**for Working at Home and Keeping Contact w Friends/Family

**Data Ethics - The New Competitive Advantage** 

#### What is DataEthics.eu

We are a European independent non-profit organisation with a global outreach established in 2015. Our aim is to ensure a human-centric approach to data systems and development. Read more about background and values and Meet the team.

#### DataEthics Research

The objective of DataEthics Research/Academic (DataEthics RA) is to conduct and publish interdisciplinary constructive research with a trans-technical and

### DataEthics.eu A ThinkDoTank

**Benefit** – Who benefits from the data processing

**Data control** – Who has primary control (access, storage, consent)?

**Transparency** – Are data processes transparent (do people understand what happens with their data)?

**Accountability** – Can the system be audited?

**Considerations** – Are special needs of vulnerable citizens considered (e.g., children)?

**Values for the future** – Designing sustainable data solutions.

#### DATA ETHICS PRINCIPLES

#### BENEFIT

-who benefits from the data processing?

#### DATA CONTROL

who has primary control (access, storage consent)?

#### TRANSPARENCY

 are data processes transparent? do people understand what happens with their data?

#### ACCOUNTABILITY

- can the system rectify? can it be audited?

#### PARTICULAR CONSIDERATIONS

are special needs of vulnerable citizens considered (children e.g.)?

#### VALUES FOR THE FUTURE

 designing sustainable data solutions. Not just for the here and now

#### DATAETHICS



Principles and Guidelines for Companies, Authorities & Organisations

© DataEthics.eu
The Independent Thinkdistank

### **Data Ethics Principles**

- David Hand IMS Bulletin (Jan/Feb 2019) – Data and analysis should...
  - Serve the public good
  - Be non-discriminatory
  - Be trustworthy and honest
  - Protect individual identities
  - Adhere to legal requirements



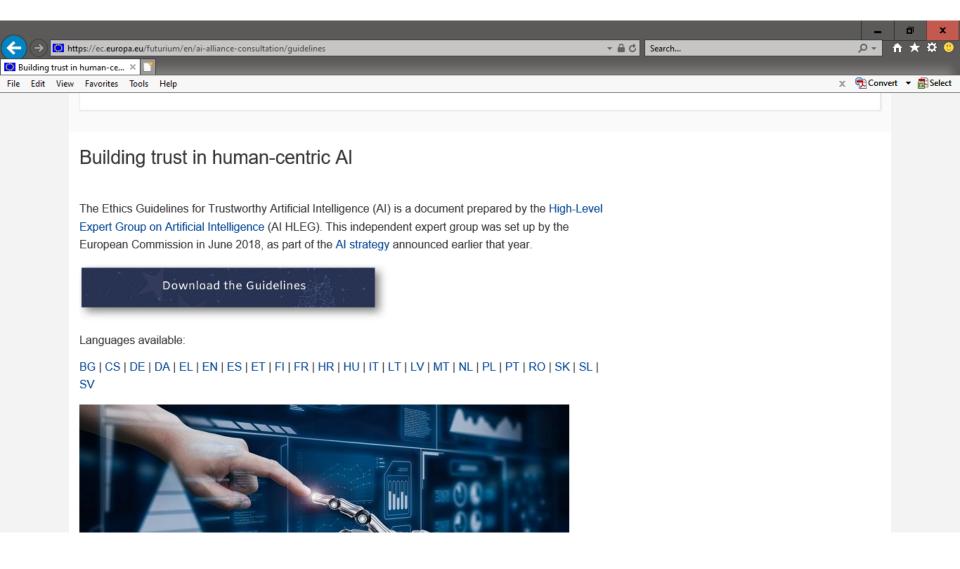
### Data Ethics Principles – UK

- Start with clear user need & public benefit
- Be aware of relevant legislation and codes of practice
- Use data that is proportionate to the user need
- Understand the limitations of the data
- Use robust practices and work within your skillset
- Make your work transparent and be accountable
- Embed data responsibly



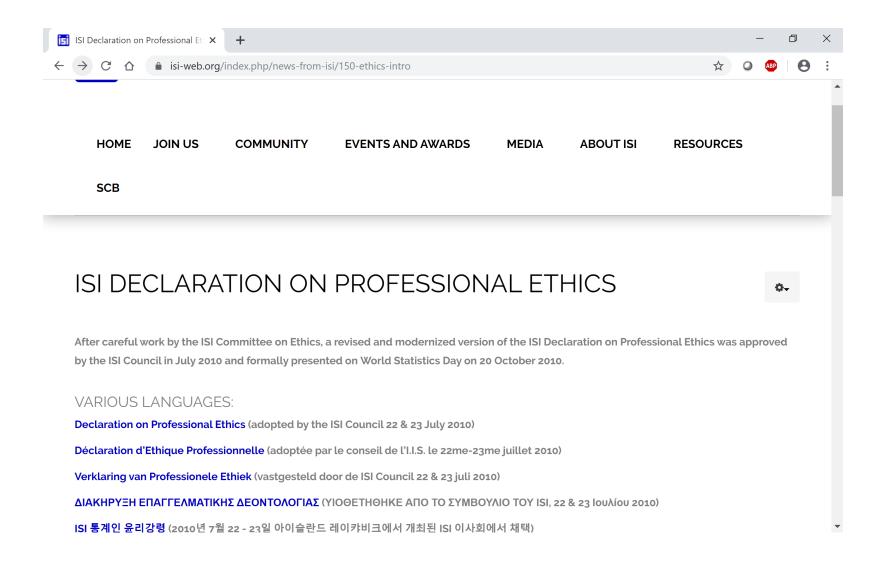
https://www.gov.uk/government/ publications/data-ethicsframework/data-ethicsframework

#### https://ec.europa.eu/futurium/en/ai-alliance-consultation/guidelines



# What are we doing now?

### ISI-International Statistical Institute



# Ethical Guidelines for Statistical Practice

https://www.amstat.org/ ASA/Your-Career/Ethical-Guidelines-for-Statistical-Practice.aspx

- Professional Integrity and Accountability
- Integrity of Data and Methods
- Responsibilities to Science/Public/Funder/Client
- Responsibilities to Research Subjects
- Responsibilities to Research Team Colleagues
- Responsibilities to Other
   Statisticians & Data Scientists
- Responsibilities Regarding Allegations of Misconduct
- Responsibilities of Employers



# Ethical Guidelines for Statistical Practice

# Principle B

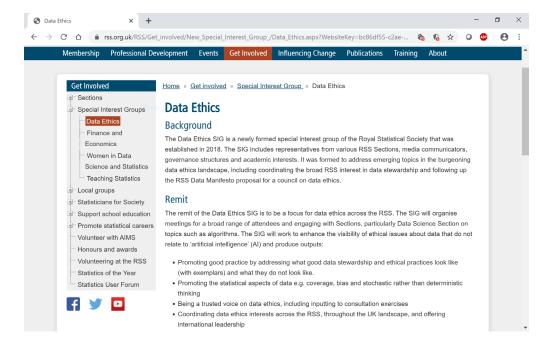
#### Integrity of data and methods

The ethical statistician is candid about any known or suspected limitations, defects, or biases in the data that may affect the integrity or reliability of the statistical analysis.

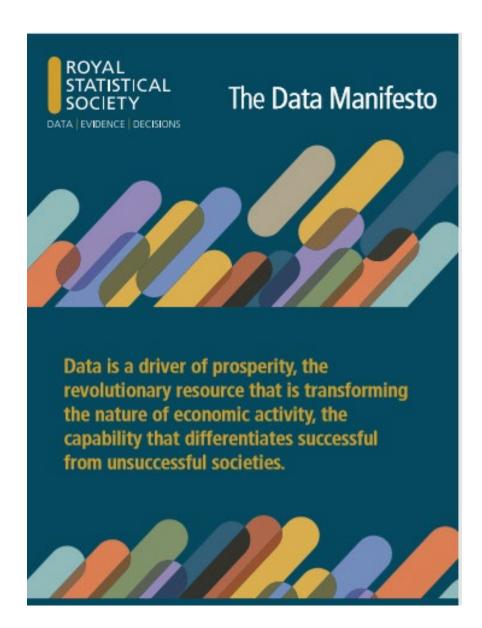
Objective and valid interpretation of the results requires that the underlying analysis recognizes and acknowledges the degree of reliability and integrity of the data.



# Royal Statistical Society

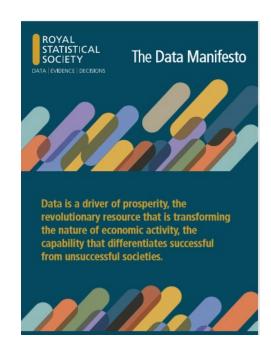


# Royal Statistical Society



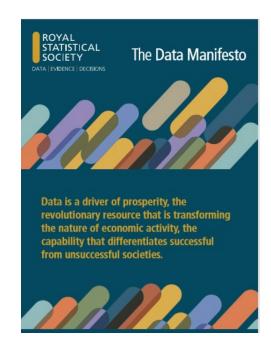
# Royal Statistical Society

- Ensure official statistics are at the heart of policy debate
- Commit to greater data sharing between government departments for statistics and research purposes
- Champion basic training in data handling and statistics for politicians, policymakers and other professionals working in public services
- Maintain the commitment to keep pace with other leading scientific nations on investment in research and development
- Give the Office for National Statistics and the wider Government Statistical Service adequate resources



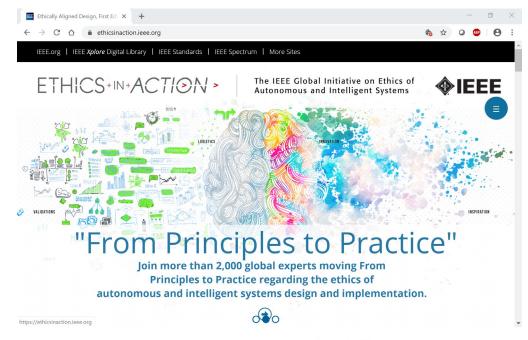
# Royal Statistical Society

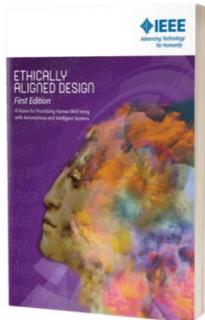
- Prepare for the data economy by skilling (training) up the nation
- Involve the public in shaping the conversation about how data is used.
- Misinformation needs countering but without undermining free speech
- Move beyond averages and break down data to a much more granular level
- Keep data regulation updated to protect the public



# IEEE — Ethics in Action

https://ethicsinaction.ieee.org/ #read





# General Principles

- Respect, promote & protect internationally recognized human rights
- Increased human well-being as success criterion
- Individuals to access and securely share data & to have control over their identity
- Provide evidence of effectiveness and fitness for purpose
- Transparency in decision making
- Unambiguous rationale for decisions accountability
- Guard against all potential misuses and risks
- Specify **competence** required for operation

# Legislation

What countries are doing...

# Protecting Data via Laws

- Protection of personal data is critical.
- Europe GDPR General Data Protection Regulation
- India Personal Data Protection Act
- Brazil General Data Protection Law
- California (US) California
   Consumer Protection Act

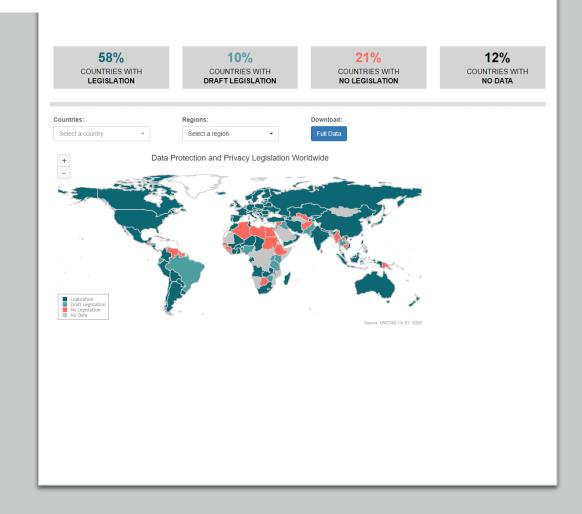


# Protecting Data Rights

- Right to be informed
- Right to object
- Right of access
- Right to rectification or to be corrected/fixed
- Right to be forgotten

#### Data Protection and Privacy Legislation Worldwide

https://unctad.org/en/Pages/DTL/STI and ICTs/ICT4D-Legislation/eCom-Data-Protection-Laws.aspx



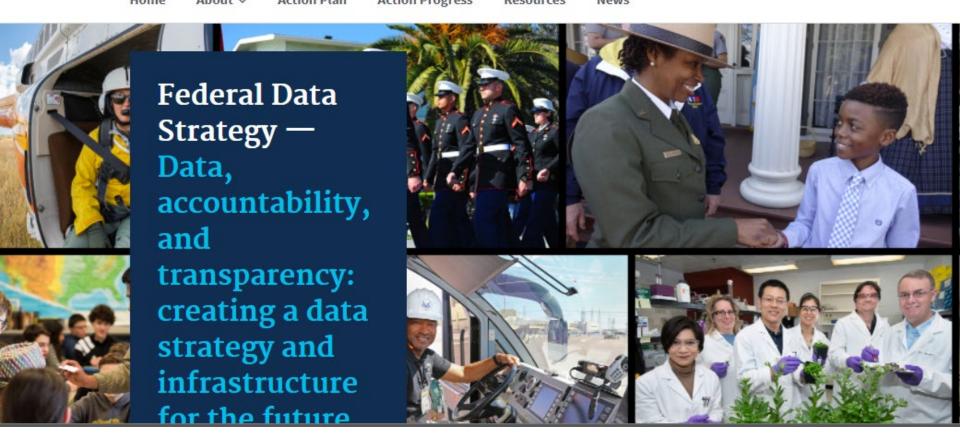


https://www2.de loitte.com/conte nt/dam/Deloitte/ lu/Documents/p ublic-sector/lugovernmenttrends-2020.pdf



## US – Federal Data Strategy





## US – Federal Data Strategy

#### What is the Purpose of the Federal Data Strategy?

The use of data is transforming the world. The way the Federal Government provides, maintains, and uses data has a unique place in society, and maintaining trust in Federal data is pivotal to a democratic process. To meet the changing role of data and needs of democracy, the Federal Government created a coordinated and integrated data strategy that better enables data to deliver on mission, serve the public, and steward resources while respecting privacy and confidentiality.

The mission of the Federal Data Strategy is to fully leverage the value of federal data for mission, service, and the public good by guiding the Federal Government in practicing ethical governance, conscious design, and a learning culture.

- The Federal Data Strategy, which comprises the Mission Statement, Principles, and Practices, provides a whole-of-government vision
  and offers guidance on how agencies should manage and use Federal data.
- Annual Government-wide Action Plans identify concrete steps for agencies in a given year, to achieve the long-term vision.

The Federal Data Strategy is designed to derive value from data while supporting robust data governance and protecting security, privacy, and confidentiality.

https://strategy.data.gov/news/2020/12/01/data-skills-catalog-and-data-ethics-framework/

### Data Skills Catalog and Data Ethics Framework Now Available

December 1, 2020

**Washington** – The mission of the Federal Data Strategy (FDS) is to fully leverage the value of federal data for mission, service, and the public good.

As part of the FDS 2020 Action Plan, the General Services Administration (GSA) committed to complete **Action 13: Develop a Curated Data Skills Catalog (Catalog) and Action 14: Develop a Data Ethics Framework (Framework)**.

- The <u>Catalog</u> can be used to help agencies develop competencies for managing data as a strategic asset and making data-driven decisions.
- The <u>Framework</u> can be used by federal leaders and data users as they make ethical decisions when acquiring, managing, and using
  data to support their agency's mission.

The release of these products marks the culmination of months of work by data experts across the Federal Government. We are grateful to the teams who made this possible. The Catalog and Framework are <u>now available</u> on resources.data.gov. Read and use today!

UN Secretary-General's Data Strategy 2020-22

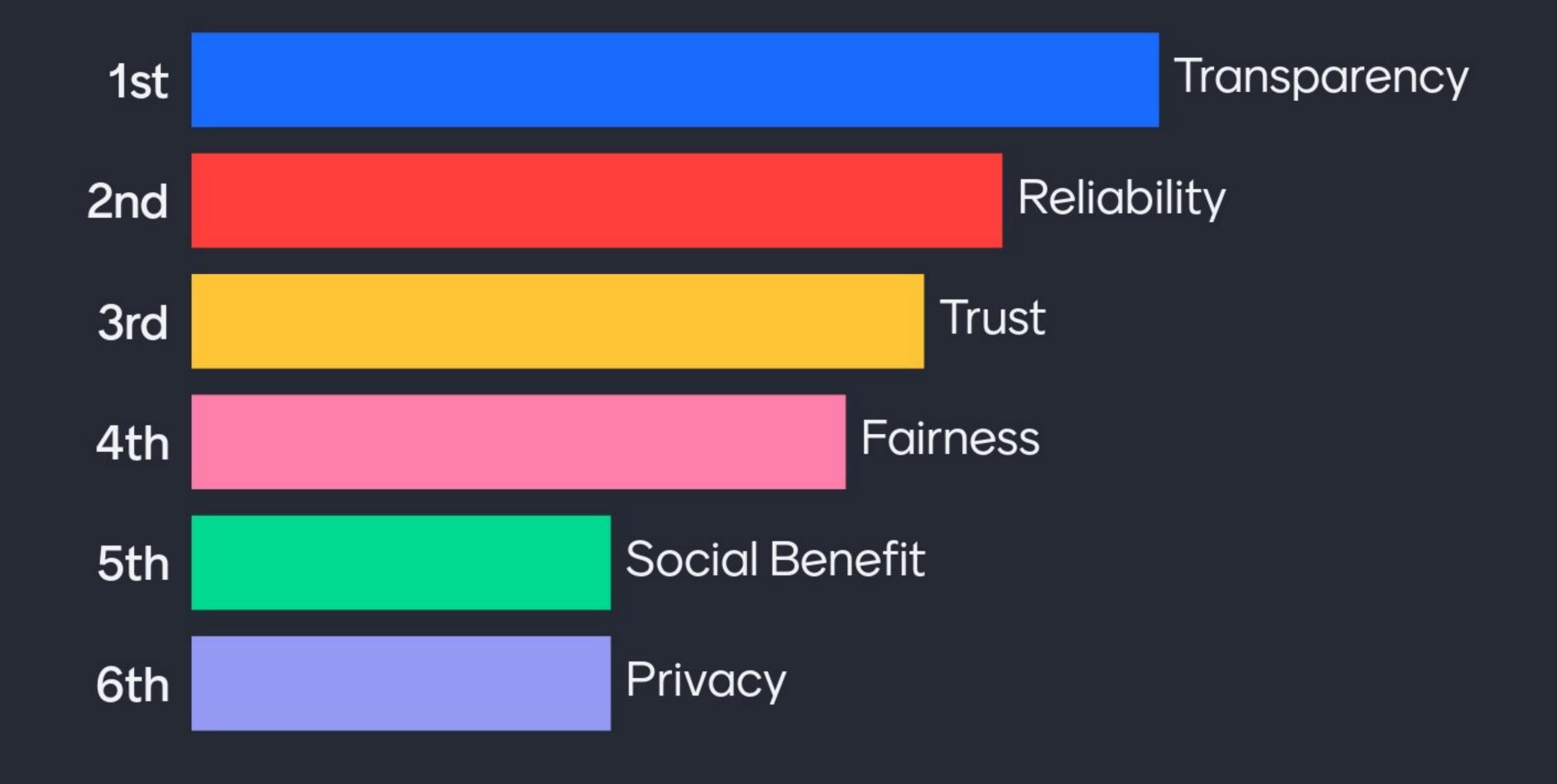


https://www.un.org/en/content/datas trategy/images/pdf/UN SG Data-Strategy.pdf What data ethics principles are important to you?

We discussed several principles.

Go to <a href="https://www.menti.com">www.menti.com</a> and enter the code.

# Ranking





### Mentimeter

# Name one thing you will tell others about data ethics

General awareness

If you haven't started thinking about it, you should.

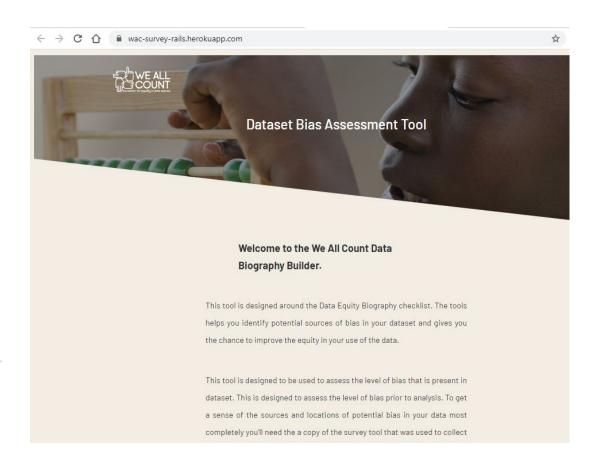
Explainability of models



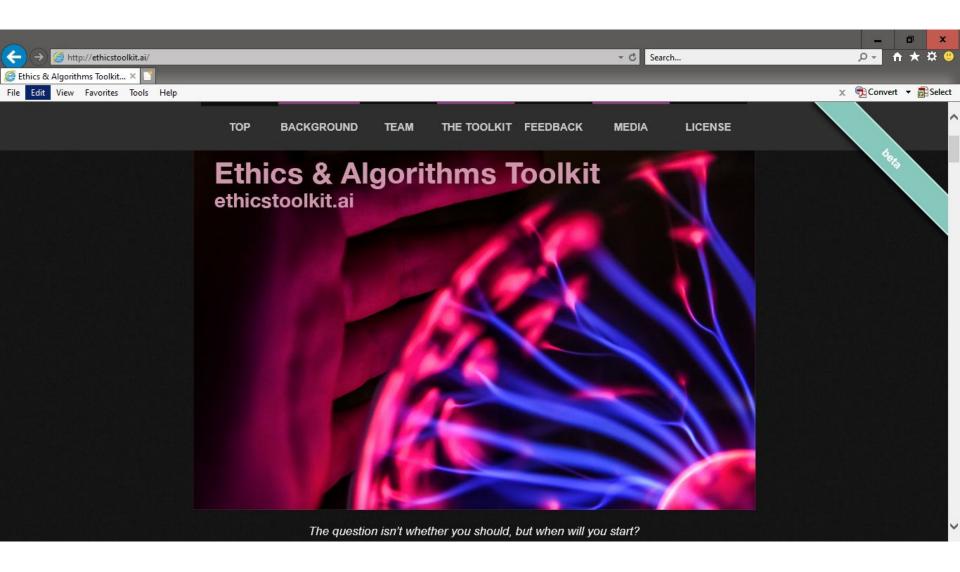
# Tools

To help us navigate to a better future...

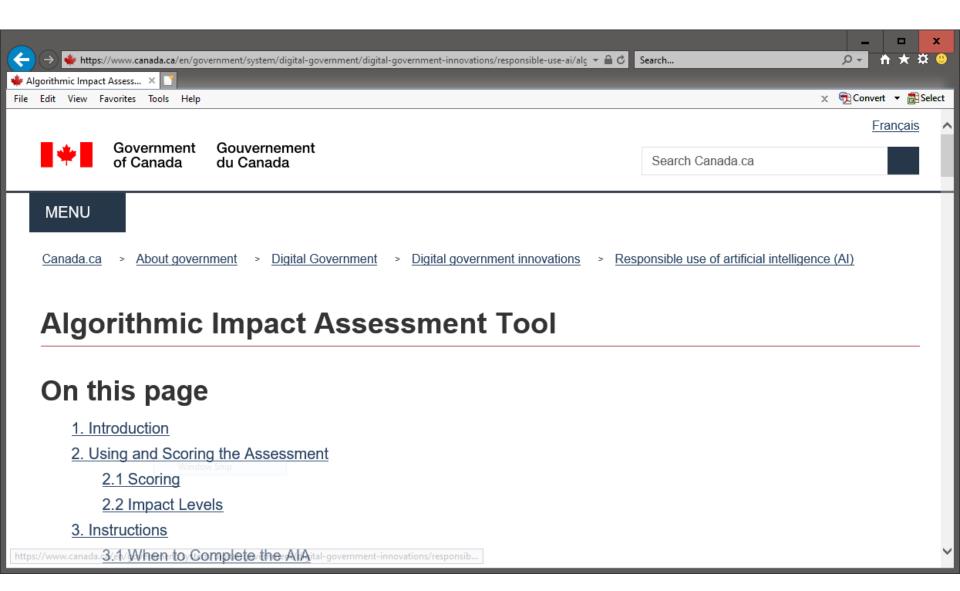
# https://wac-survey-rails.herokuapp.com/



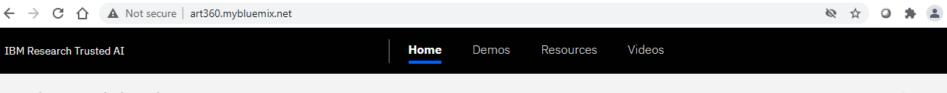
### http://ethicstoolkit.ai/



https://www.canada.ca/en/government/system/digital-government/digital-government-innovations/responsible-use-ai/algorithmic-impact-assessment.html



# http://art360.mybluemix.net/



#### Adversarial Robustness 360

The open source Adversarial Robustness Toolbox provides tools that enable developers and researchers to evaluate and defend machine learning models and applications against the adversarial threats of evasion, poisoning, extraction, and inference.



Get Code ↗

Not sure what to do first? Start here!

#### **Read More**

Learn about adversarial robustness concepts, terminology, and tools before you begin.

#### Try Web Demos

Explore interactive web demos that illustrate the capabilities available in this toolbox.

#### Watch Videos

Watch videos to learn more about the Adversarial Robustness Toolbox.

#### Read a Paper

Read a paper describing the details of the Adversarial Robustness Toolbox.

#### **Use Tutorials**

Step through a set of indepth examples to evaluate and defend AI models.

# Another story...



# CODEDBIAS

A SHALINI KANTAYYA FILM





### NETFLIX



#### **Coded Bias**

2020 | TV-MA | 1h 25m | Social & Cultural Docs

This documentary investigates the bias in algorithms after M.I.T. Media Lab researcher Joy Buolamwini uncovered flaws in facial recognition technology.

### Contact Information

- martinezw@verizon.net;
   martinez.wendy@bls.gov
- Office phone: +1 202-691-7400
- Cell: +1 202-360-3588

- Listening to recordings:
   https://www.bloomberg.com/news/articles/2019-04-10/is-anyone-listening-to-you-on-alexa-aglobal-team-reviews-audio
- Algorithm bias: <u>https://www.nytimes.com/2019/11/19/technolog</u> y/artificial-intelligence-bias.html
- Paper on strengthening ethics via guidelines. https://osf.io/preprints/socarxiv/93wuk
- https://phys.org/news/2017-02-statistics-ethicallycombat-scientific-credibility.html
- Latest issue of HDSR Harvard Data Science Review

   article on algorithms:
   https://hdsr.mitpress.mit.edu/pub/56lnenzj
- https://www.academia.edu/17607856/Creating a culture of ethics in Biomedical Big Data adap ting guidelines for professional practice to pro mote ethical use and research practice
- https://www.academia.edu/29647535/A beginner
   guide to reasoning with the ASA Ethical Guidelines

- Cynthia Rudin speaks a lot about interpretable models.
  - https://www.nature.com/articles/s42256-019-0048-x
  - <a href="https://rss.onlinelibrary.wiley.com/doi/abs/">https://rss.onlinelibrary.wiley.com/doi/abs//10.1111/rssa.12227</a>
  - One of the relevant full papers is here: <a href="https://arxiv.org/pdf/1811.10154.pdf">https://arxiv.org/pdf/1811.10154.pdf</a>
- https://ec.europa.eu/research/participants/dat a/ref/h2020/grants manual/hi/ethics/h2020 hi ethics-self-assess en.pdf
- https://bdes.datasociety.net/counciloutput/example-big-data-researchcontroversies/
- http://raw.rutgers.edu/docs/wcars/38wcars/Pr esentations/Dan%20-%20Ethics%20for%20Big%20Data%20and%20A nalytics.pdf
- http://magnacartafordata.org/about/dataethics-case-studies-project/

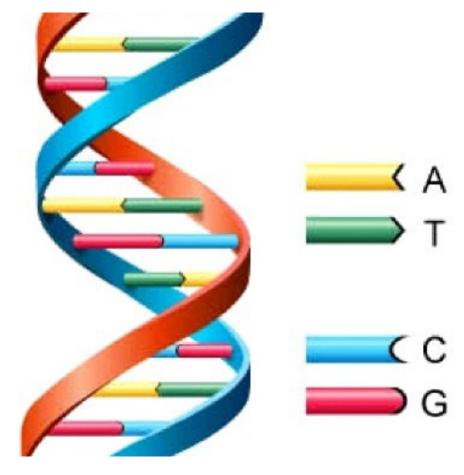
- https://assets.publishing.service.gov.uk/government/upl oads/system/uploads/attachment\_data/file/737137/Data Ethics Framework.pdf
- https://www.gov.uk/government/publications/dataethics-framework/data-ethics-framework
- https://www2.deloitte.com/us/en/insights/industry/publ ic-sector/government-trends/2020/government-data-aiethics.html
- https://www2.deloitte.com/content/dam/insights/us/articles/government-trends-2020/DI\_Government-Trends-2020.pdf
- https://www.dataversity.net/what-are-data-ethics/#
- https://blog.datasciencedojo.com/big-data-ethics-10experiments/
- https://aiethics.princeton.edu/case-studies/

- https://aiethics.princeton.edu/casestudies/case-study-pdfs/
- https://www.forbes.com/sites/ciocentr al/2018/10/29/a-rising-crescendodemands-data-ethics-and-dataresponsibility/#5237979ab5d5
- https://wac-surveyrails.herokuapp.com/
   assess bias in a data set.
- https://www.nature.com/articles/d415 86-020-00274-3?utm\_source=Nature+Briefing&utm\_campaign=dcc6ede003-briefing-dy-20200204&utm\_medium=email&utm\_term=0\_c9dfd39373-dcc6ede003-44476129
- https://www.nbcnews.com/news/usnews/police-were-cracking-cold-casesdna-website-then-fine-print-n1070901



### DNA – Genealogy

- April 2018 Golden State Killer found in part by submitting DNA to a DNA database
- Information on distant relatives helped identify him
- Privacy policies changed to restrict law enforcement searches ... Unless one opts in
- Would you opt in?
- Would it depend on the type of offense?
- Go to menti.com



https://www.nbcnews.com/news/us-news/police-were-cracking-cold-cases-dna-website-then-fine-print-n1070901

### More DNA ...

- Direct-to-consumer DNA testing provides genetic information
  - Determining ancestry
  - Finding mutations diseases
- Other uses of genetic information
  - Medical research
  - Drug development
- Would you agree to share your DNA to a for-profit company for research?
- What are the dangers of freely sharing genetic information?
  - https://pharmacogeneticstesting.com/ pharmacogenomic-companies/23andmenew-genetic-testing-products/

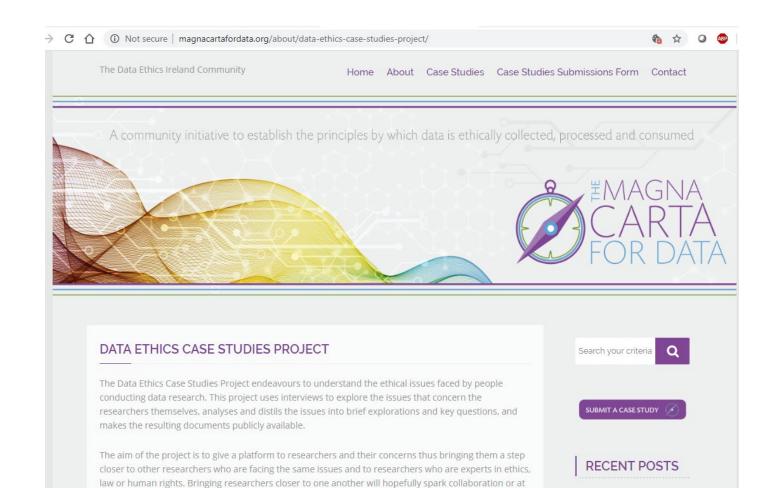
### OkCupid Data Set

- In 2016 ... data from ~70,000 OkCupid profiles were released – Open Science Framework (osf.io)
- Two researchers scraped data with a bot profile
  - Age
  - Gender
  - Sexual orientation
  - Personal responses
- Did not think violated ethics data is public.
- What do you think?
- Go to menti.com.



# Education

Through case studies and more...



least co-operation and problem solving when it comes to ethical problems.

Fake news - technology as

part of the solution, not just

# Case Studies in Ethics (NSF)



# Case Studies in Ethics

- Include data ethics in all courses not just one lecture
- Case studies have been developed.
- Council for Big Data, Ethics, and Society
  - https://bdes.datasociety.net
- Real situations ...
  - Should academic researchers use hacked data sets that have been released in public?
  - What to consider when researchers co-opt Internet of Things (IoT) devices without knowledge or consent?

# Case Studies in Ethics

#### **Ethics Education for Geospatial Professionals Products**



#### gisprofessionalethics.org

About this Project | Case Studies | Codes of Ethics | Syllabi | Interview Protocols | Other

#### **Case Studies**

Students develop ethical awareness and moral reasoning skills through methodical analysis and discussion of case studies. The main contribution of the GIS Professional Ethics Project is a collection of case studies that pose a range of ethical challenges faced by geospatial professionals. Related educator resources are available on request for most cases.

To learn more about the case method, including a "Seven Step Guide for Ethical Decision Making," see Davis, Michael (1999) The Case Method. *Ethics and the University*. New York: Routledge. For an example of ethical decision making using the

https://www.e-education.psu.edu/research/projects/gisethics

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For more information about GIS ethics, see DiBiase, D. (2017). Professional and Practical Ethics of GIS&T. *The Geographic Information Science & Technology Body of Knowledge* (2nd Quarter 2017 Edition), John P. Wilson (ed.). doi: 10.22224/gistbok/2017.2.2

mapping muslim neighbors case.pdf	$\label{lem:Apolice} A \ police \ department's \ plan \ to \ map \ potential \ terrorist \ enclaves \ brings \ charges \ of \ racial \ profiling.$
caribou_routes_case.pdf	A GIS analyst is asked to exclude pertinent data from maps prepared for a public hearing.
mobile_phone_tracking_case.pdf	Researchers track mobile phone users' movements to derive predictive models of human mobility. <i>Updated 4 December 2019</i>
software_emergency_case.pdf	Too few software licenses are available in the aftermath of a tsunami.

#### **Case Studies Ethics**

https://ethics.acm.org/integrityproject/case-studies/

#### Case Studies

The ACM Code of Ethics and Professional Practice ("the Code") is meant to be a **usef** code, a document that can inform practice and education. It is useful as the conscient the profession, but also for individual decision-making. The following resources may use in learning to apply the Code to your own situation.

As prescribed by the Preamble of the Code, computing professionals should approach dilemma with a holistic reading of the principles and evaluate the situation with thoughtful consideration to the circumstances. In all cases, the computing profession should defer to the public good as the paramount consideration. The analyses in the following fictional cases highlight the intended interpretations of members of the 201 Code task force.

- Malware Disruption: Security vendors and government organizations collabor disrupt the operation of an ISP that hosts malware.
- Medical Implant Risk Analysis: A medical implant device maker creates a sm phone application to monitor and control the device.
- Abusive Workplace Behavior: A manager fails to address abusive behavior by technical team leader.
- Autonomous Active Response Weapons: A defense contractor that specializ autonomous vehicles begins to integrate automated weaponry.
- <u>Dark UX Patterns</u>: A web developer realizes that their client's requests are inte
  to trick users into making accidental and expensive purchases.
- Malicious Inputs to Content Filters: An Internet content filtering service dependence in machine learning techniques to automate the classification of blocked content.

#### Data Science Framework

Source: S. A. Keller, V. Lancaster, S. Shipp. (2017). Building Capacity for Data Driven Governance - Creating a New Foundation for Democracy, Statistics and Public Policy, 4:1-11. https://amstat.tandfonline.com/doi/full/10.1080/2330443X.2017.1374

PROBLEM IDENTIFICATION: THEORIES AND WORKING HYPOTHESES

DATA DISCOVERY [INVENTORY | SCREENING | ACQUISITION]

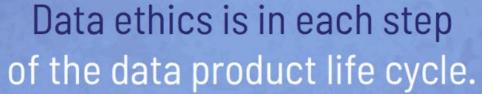
DATA INGESTION AND GOVERNANCE

DATA WRANGLING
PROFILING • PREPARATION • LINKAGE • EXPLORATION

FITNESS-FOR-USE

STATISTICAL MODELING AND ANALYSES

**COMMUNICATION AND DISSEMINATION** 





https://weallcount.com/the-data-process/

#### DataEthics.eu

#### DATA ETHICS PRINCIPLES

#### RENEFIT

-who benefits from the data processing?

#### DATA CONTROL

 who has primary control (access, storage, consent)?

#### TRANSPARENCY

 are data processes transparent? do people understand what happens with their data?

#### ACCOUNTABILITY

- can the system rectify? can it be audited?

#### PARTICULAR CONSIDERATIONS

 are special needs of vulnerable citizens considered (children e.g.)?

#### VALUES FOR THE FUTURE

 designing sustainable data solutions. Not just for the here and now

#### DATAETHICS