

# The Alan Turing Institute

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## Rethink government with data science and AI

Dr Cosmina Dorobantu

Deputy Director, Public Policy Programme



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# Agenda

- ① Why should researchers be interested in data science for policy?
- ② How is The Alan Turing Institute trying to help?
- ③ What can data science and AI do for policymakers?

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# Data science and AI have enormous potential to make government better



Tailor education to the needs of each child



Reduce street crime



Fit healthcare to each patient



Alleviate the cost of financial crises



Prevent traffic deaths



Intervene early for children at risk

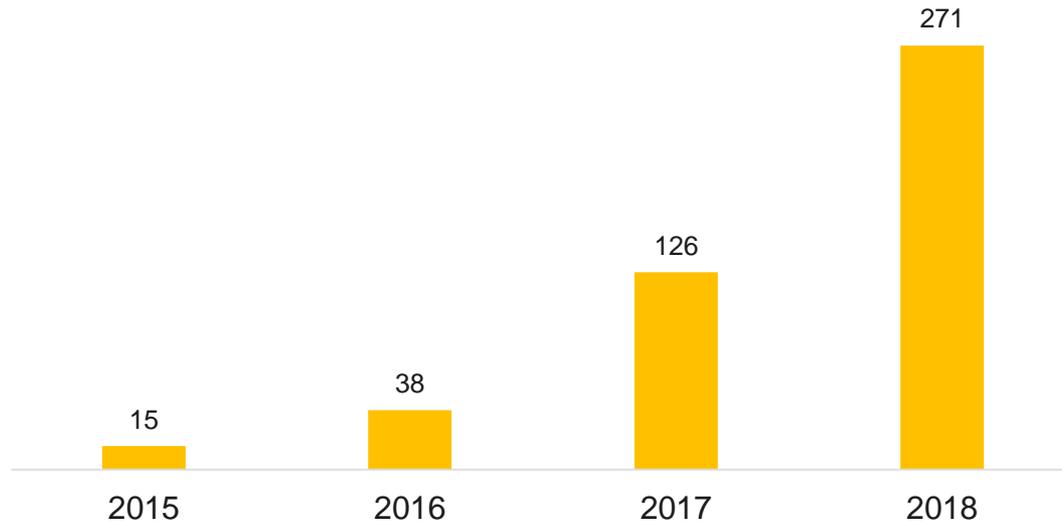


Making government more efficient, fair, responsive, prescient, and sustainable

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In the UK, the past few years have seen exponential growth in government's interest in data science and AI

Government announcements that mention data science or artificial intelligence



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... and a strong recognition from Ministers of the potential of these technologies for the public sector

*“We want the public sector to understand AI [...] There are huge opportunities for government to capitalise on this exciting new technology to improve lives.”*

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Despite the interest, governments around the world have a history of struggling with technological innovation

**Health  
Care**  
.gov

**UC**  
*Universal  
Credit*



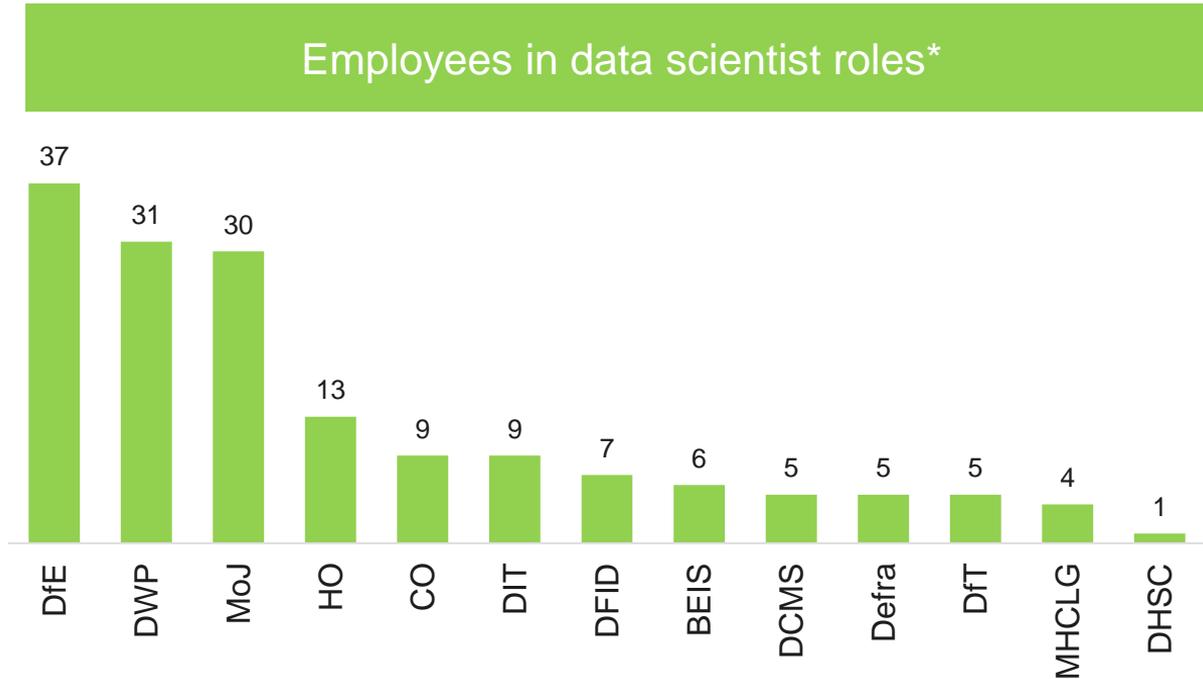
My Health Record

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... and they will struggle with data science and AI for the same reasons they struggled with earlier digital systems

Lack of in-house  
expertise

# In the UK, government departments are building their own, in-house data science expertise



\*The figures only reflect data scientists who have LinkedIn profiles.

Source: self-reported data on LinkedIn, accessed on 30 October 2019.

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# Governments will struggle with data science and AI for the same reasons they struggled with earlier digital systems

Lack of in-house  
expertise

Inability to pay  
salaries that match  
the private sector

Difficulties in  
evaluating the work  
contracted out to  
private providers

Cultural barriers  
amplified by past IT  
disasters

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Independent academic researchers have a duty to help governments maximise the potential of data science and AI

**The  
Alan Turing  
Institute**

**Stanford**

Human-Centered  
Artificial Intelligence



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# Agenda

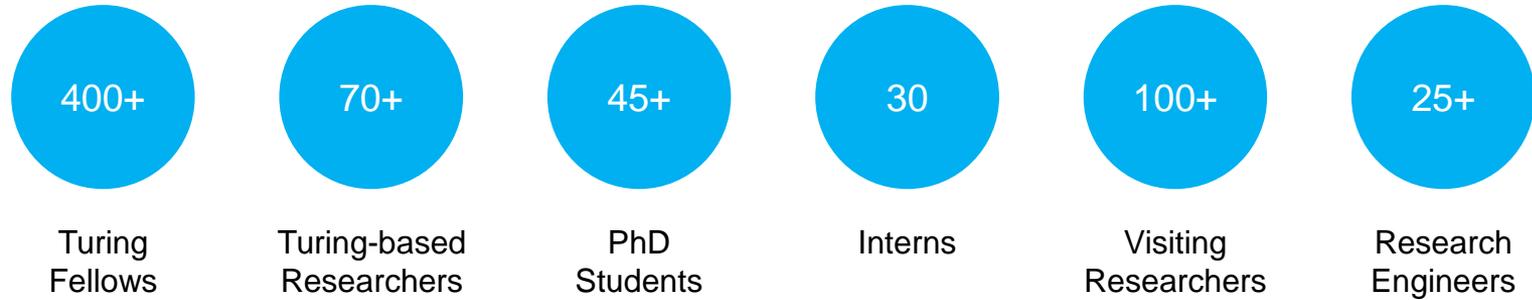
- ① Why should researchers be interested in data science for policy?
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# The Turing is UK's national institute for data science and AI



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... and has unequalled access to expertise in these domains



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# In May 2018, we launched the public policy research programme

## News

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The Alan Turing Institute launches a new research programme in data science and AI for public policy, led by Professor Helen Margetts

Posted on 9th May 2018

News

Government has fostered and embraced important advances in technology, from critical investment in the iPhone and the internet, to early adoption of large-scale computer systems in the 1960s. Today, government is a major holder of data, which data science and artificial intelligence (AI) can harness to improve the design and provision of public services as well as to inform policy-making across all levels of government.



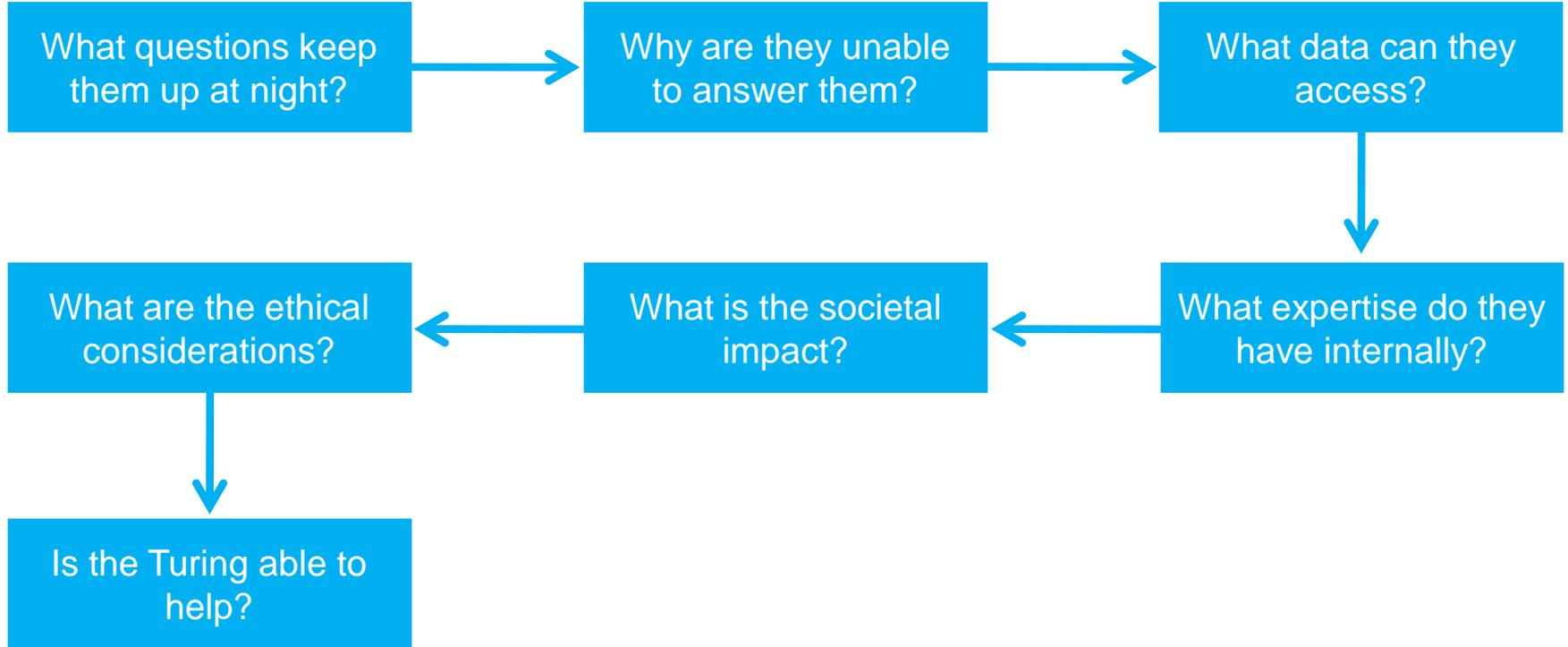
## Public policy

Working with policy makers on data-driven public services and innovation to solve policy problems, and developing ethical foundations for data science and AI policy making.

[Read more](#)

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We met with hundreds of policymakers to understand where they should focus their attention



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We identified four areas of opportunity, covering the technical as well as the ethical aspects of data science for policy

Use data science and artificial intelligence to inform policymaking

Build ethical foundations for the use of data science and AI in policymaking

Improve the provision of public services

Contribute to policy that governs the use of data science and AI

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We hired a team of seven to oversee the programme's activities



**Professor  
Helen  
Margetts**  
Political Science



**Dr Cosmina  
Dorobantu**  
Economics



**Pauline  
Kinniburgh**  
Finance



**Dr David  
Leslie**  
Philosophy  
& Ethics



**Christina  
Hitrova**  
Law



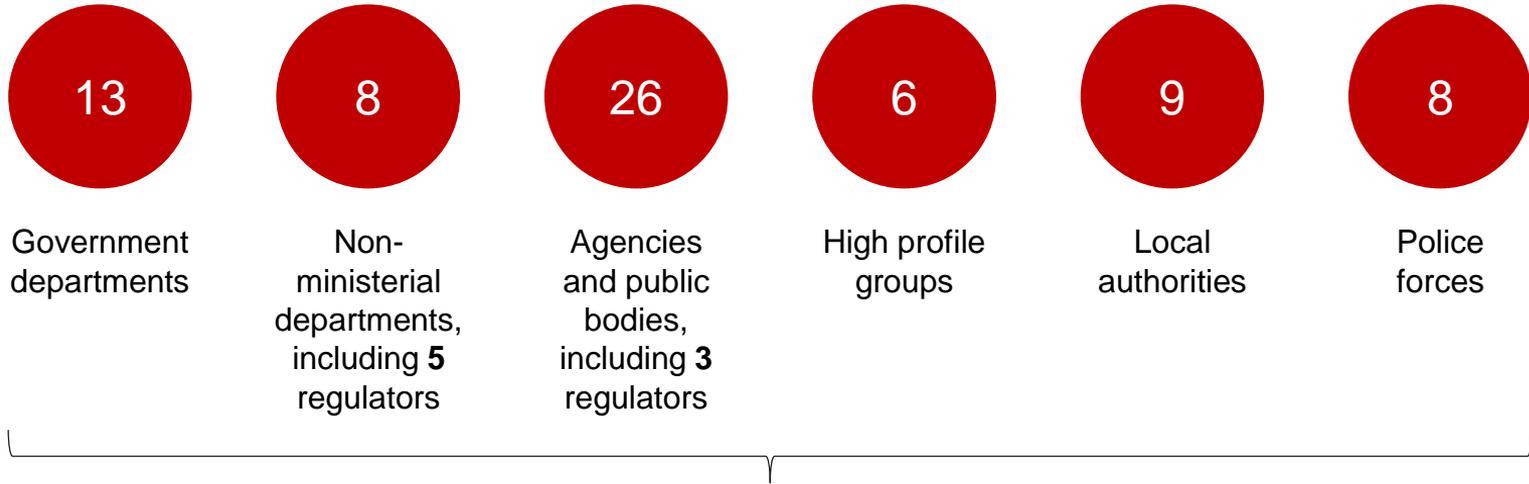
**Dr Florian  
Ostmann**  
Public Policy



**Alexander  
Harris**  
International  
Relations

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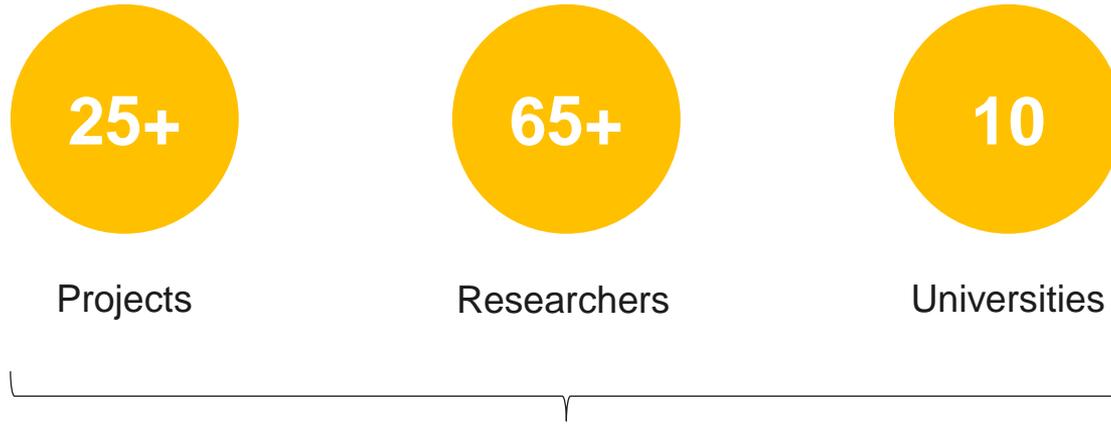
# Our job is to link the government to the Institute's community of AI researchers



**70** public sector organisations reached out to the programme for help

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We set up and oversee 25+ research projects, involving more than 65 academic researchers from 10 universities



**10,000s** of hours of work conducted for the public sector

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# Artificial intelligence is not a new field

**Greater computing power**

**Better machine learning algorithms**

**More data and cheaper storage**

**Larger investments**

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... nor is it all that it is hyped up to be



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Data science and AI are a set of digital technologies that can help policymakers with some tasks

Simulation and  
evaluation

Measurement and  
detection

Prediction and  
forecasting

Personalisation

Ethics and  
governance

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Agent computing allows us to model complex, interdependent systems



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In a policy context, agent computing gives us the ability to understand these systems better than ever

### Traffic modelling

- ◆ Old way: density =  $f$  (population, roads, economy)
- ◆ New way: model each vehicle, road, emergent jams

### Military operations

- ◆ Old way: casualties =  $g$  (red, blue, rules of engagement)
- ◆ New way: model each soldier, weapon, bullet

### Financial market and macroeconomic models

- ◆ Old way: representative agent model with aggregate data
- ◆ New way: use microdata on consumers and firms

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... and create digital replicas of our economies that we can run experiments on without hurting anyone

Start with **120 million** workers. Replicate the characteristics of the US private sector:

- ◆ **6,000,000 firms** (with employees)
- ◆ **3,000,000 job changers** each month
- ◆ **100,000 startups** each month
- ◆ **20,000 largest firms** employ half of workers
- ◆ **1 firm** with 1,000,000 employees

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We are using agent computing to help developing countries reach the sustainable development goals



The image shows a screenshot of a research project page. The background is a photograph of a 'ONE WAY' street sign with 'DEPT OF TRANSPORTATION' written on it, set against a city building. The page layout includes a navigation menu at the top with 'Home + Research + Research projects'. The main heading is 'Policy priority inference' in a large white font. Below the heading is a descriptive paragraph: 'Developing computational and network methods to advise governments on the policy priorities needed to reach socioeconomic development goals'. In the bottom left, there is a 'Learn more' button with a downward arrow. In the bottom right, there is a white box containing the text 'Related programmes' and 'Public policy' with a horizontal line underneath.

Home + Research + Research projects

## Policy priority inference

Developing computational and network methods to advise governments on the policy priorities needed to reach socioeconomic development goals

Learn more ↓

Related programmes  
Public policy

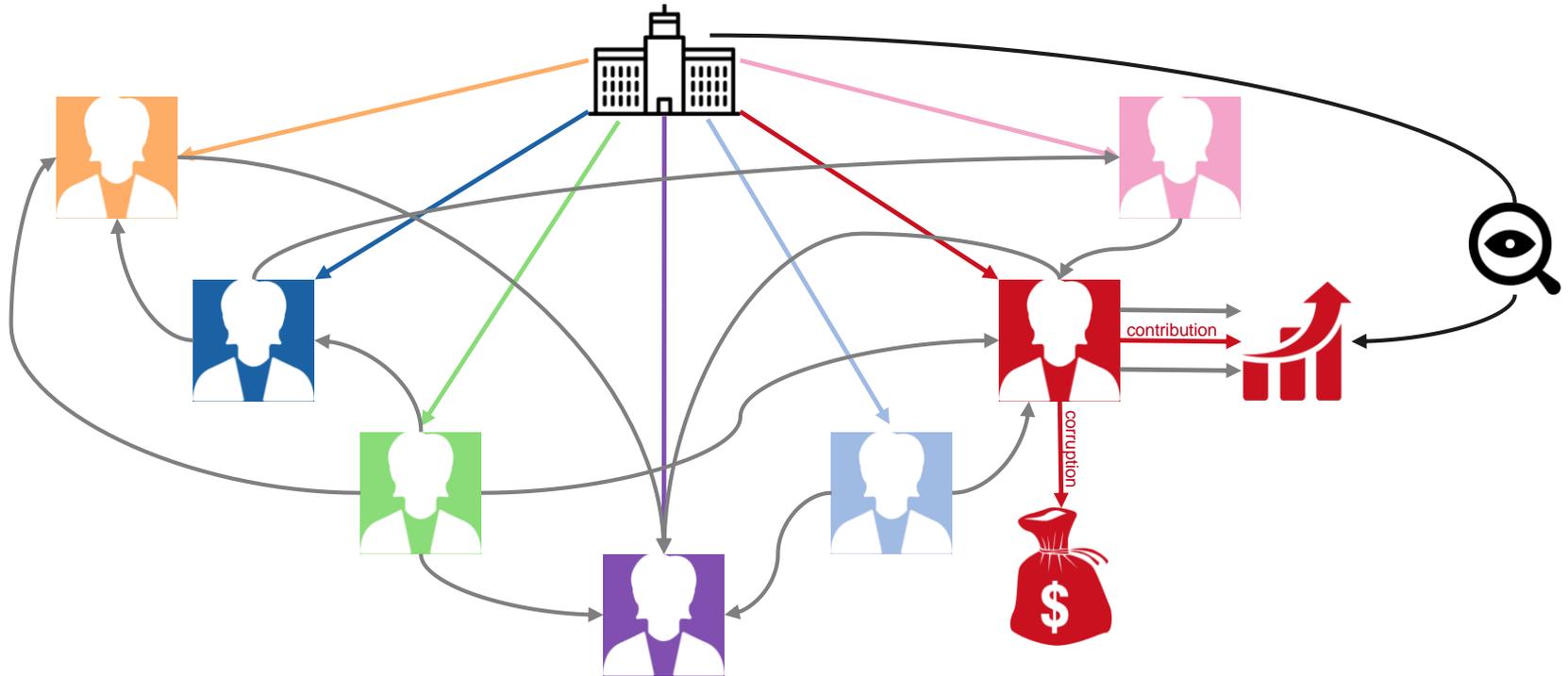
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# Setting policy priorities is not a trivial process

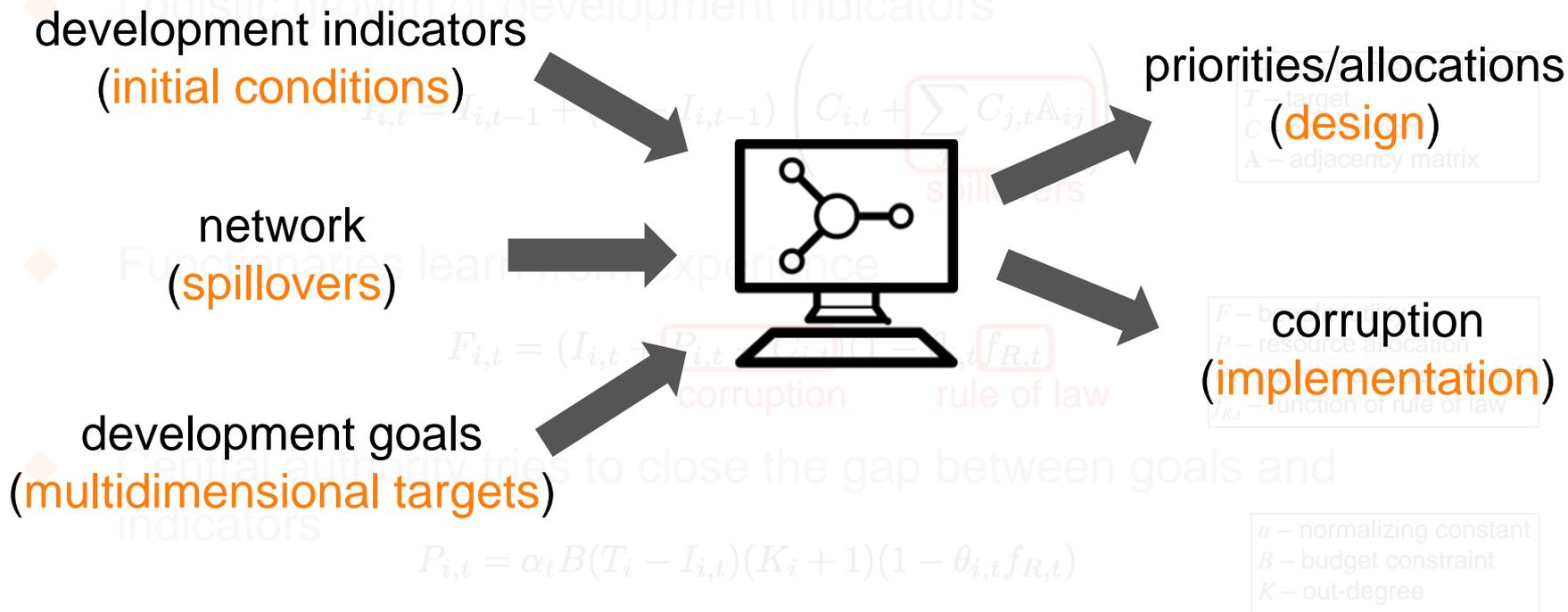
- ◆ Governments establish policy goals
  - ✧ Internal political agreements, imitating successful countries, discretionary choices, international consensus, societal pressures, etc.
- ◆ Not a trivial process
  - ✧ Growing number of indicators (232 indicators monitor the 17 SDGs)
  - ✧ Policies interact with each other (network of spillovers)
  - ✧ Design ≠ implementation
- ◆ Data do not reveal policy priorities
  - ✧ Key to evaluate and prescribe policies

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We use an agent computing approach to capture interdependencies between policy areas



# The model



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governance

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# A crude introduction to machine learning



**Dog**



**Døg**

Algorithm

Quantity of data

Quality of data

Variation in data

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## ... and a terrible joke

A machine learning algorithm walks into a bar.

The bartender asks "what will you have?"

The algorithm says...

"what is everyone else having?"

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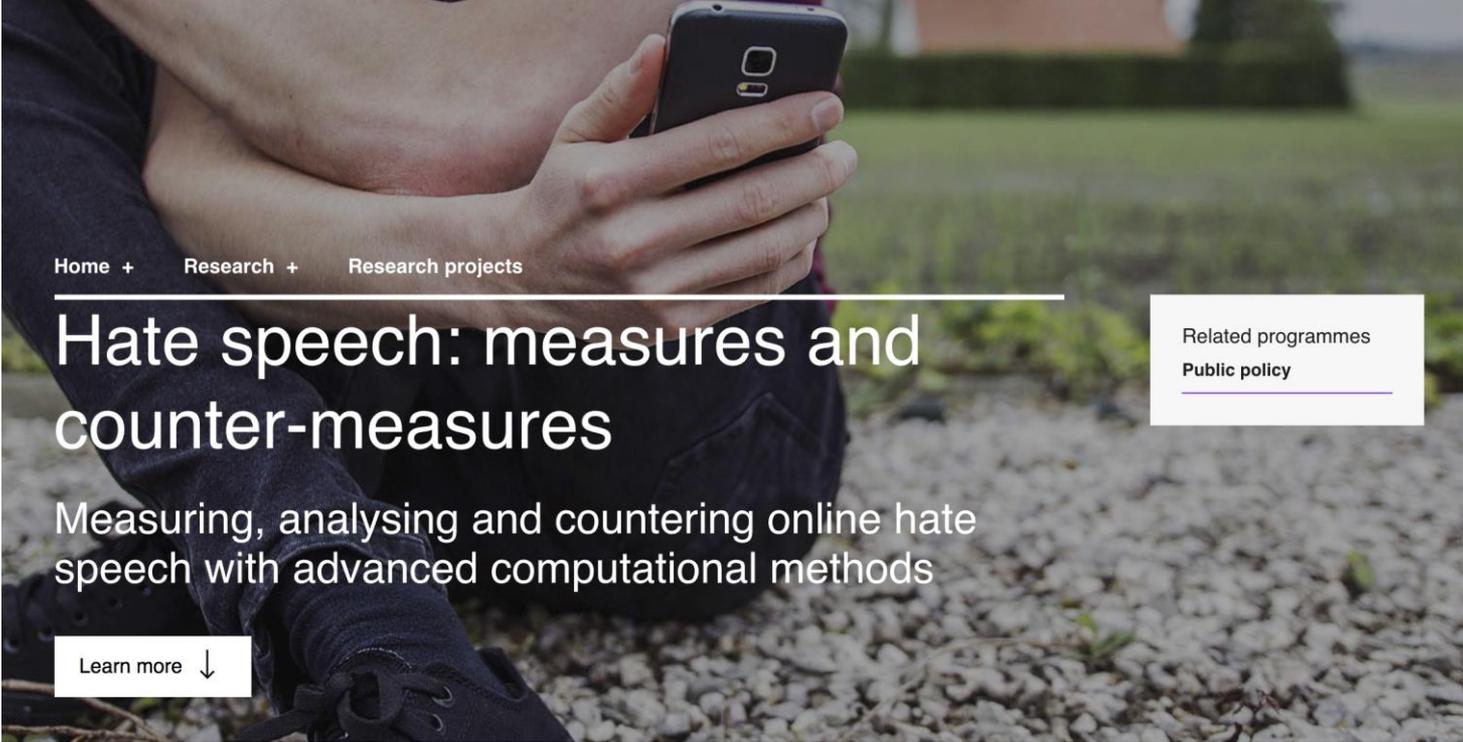
Prediction and  
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governance

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# Example Turing project



Home + Research + Research projects

## Hate speech: measures and counter-measures

Measuring, analysing and countering online hate speech with advanced computational methods

Learn more ↓

Related programmes  
Public policy

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We are measuring, analysing and countering online hate speech with advanced computational methods



Social  
science



Machine  
Learning



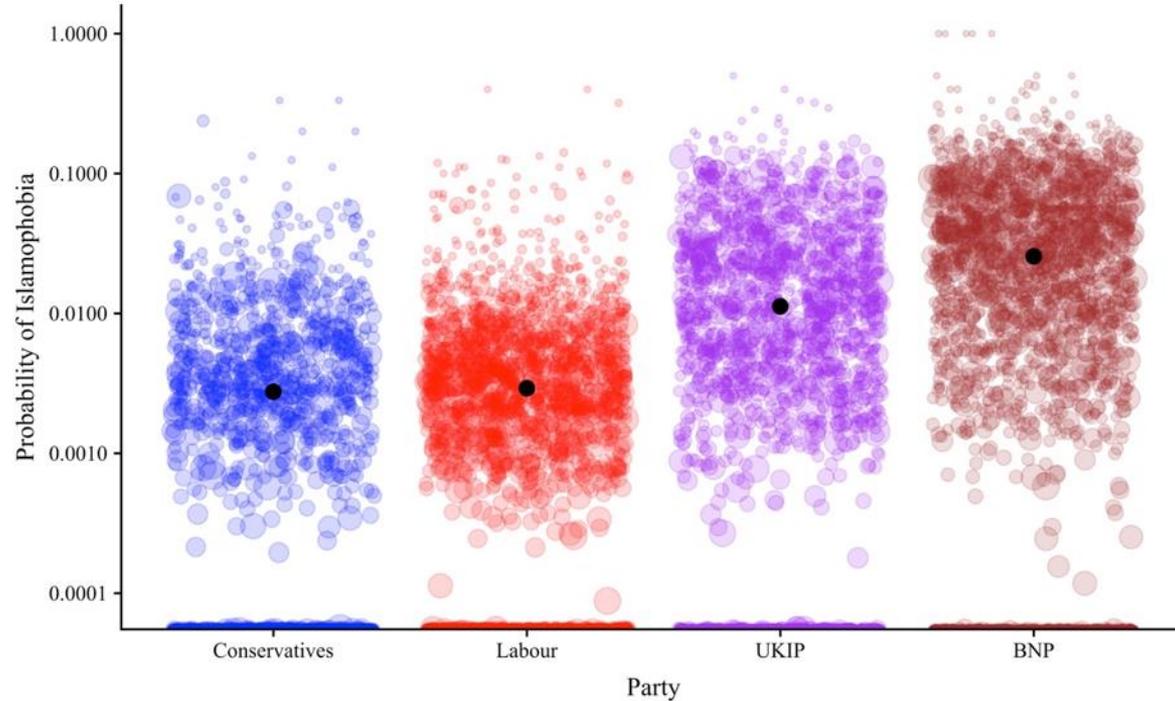
Policy

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## Aims of the project: what don't we know?

- ◆ What is online abuse?
- ◆ How we can measure it (#MachineLearning)?
- ◆ What is the scale and scope of abuse?
- ◆ Where, when, and how does it manifest?
- ◆ How is it organised?
- ◆ Variations (racism, Islamophobia, misogyny, homophobia...)
- ◆ What is the effect of receiving AND seeing abuse?
- ◆ How can we challenge it – design policy interventions?

# Patterns of hate across Twitter followers of different parties



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evaluation

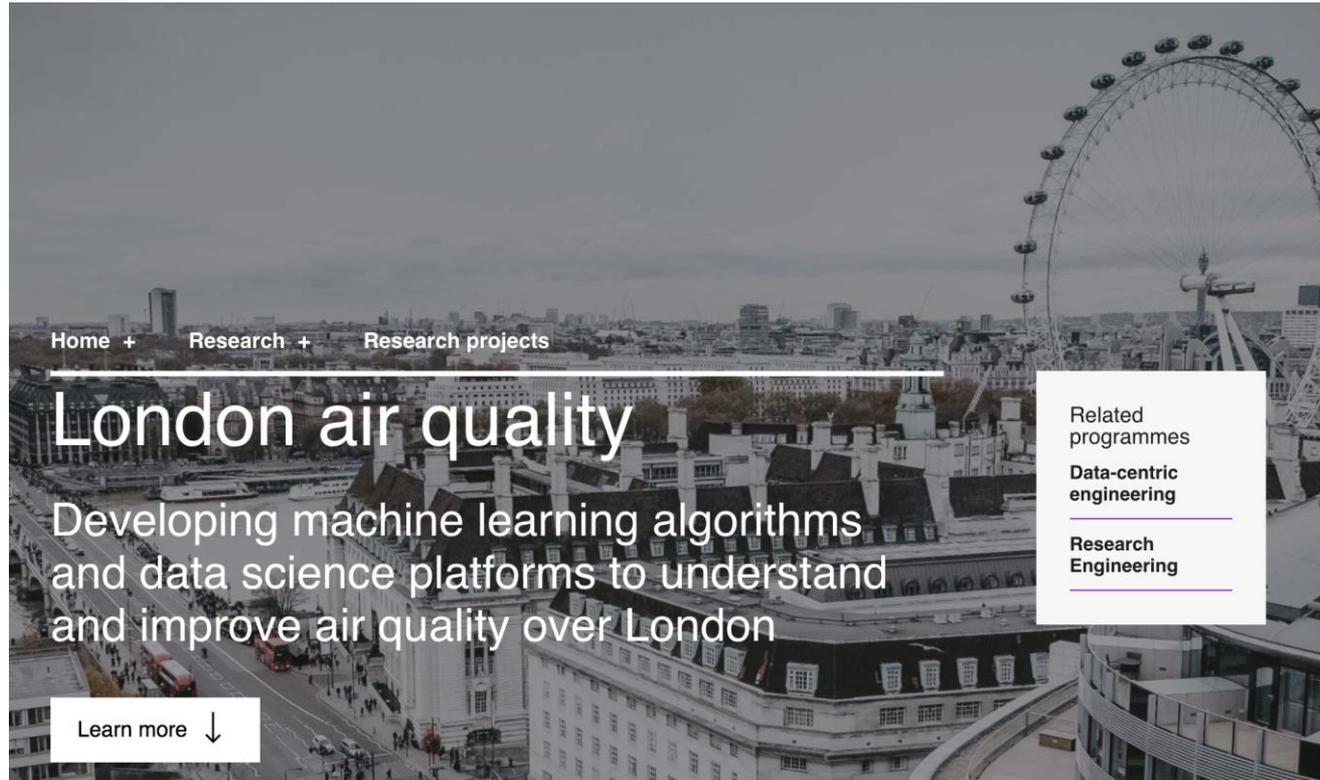
Measurement and  
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# Example Turing project



The image shows a screenshot of a website page for a Turing project. The background is a grayscale photograph of a London street scene with the London Eye visible in the distance. The page layout includes a navigation bar at the top with links for 'Home +', 'Research +', and 'Research projects'. The main heading is 'London air quality' in a large, white, sans-serif font. Below the heading is a descriptive paragraph: 'Developing machine learning algorithms and data science platforms to understand and improve air quality over London'. In the bottom left corner, there is a white button with the text 'Learn more' and a downward-pointing arrow. On the right side, there is a white box containing the text 'Related programmes', 'Data-centric engineering', and 'Research Engineering', each followed by a horizontal line.

Home + Research + Research projects

## London air quality

Developing machine learning algorithms and data science platforms to understand and improve air quality over London

Learn more ↓

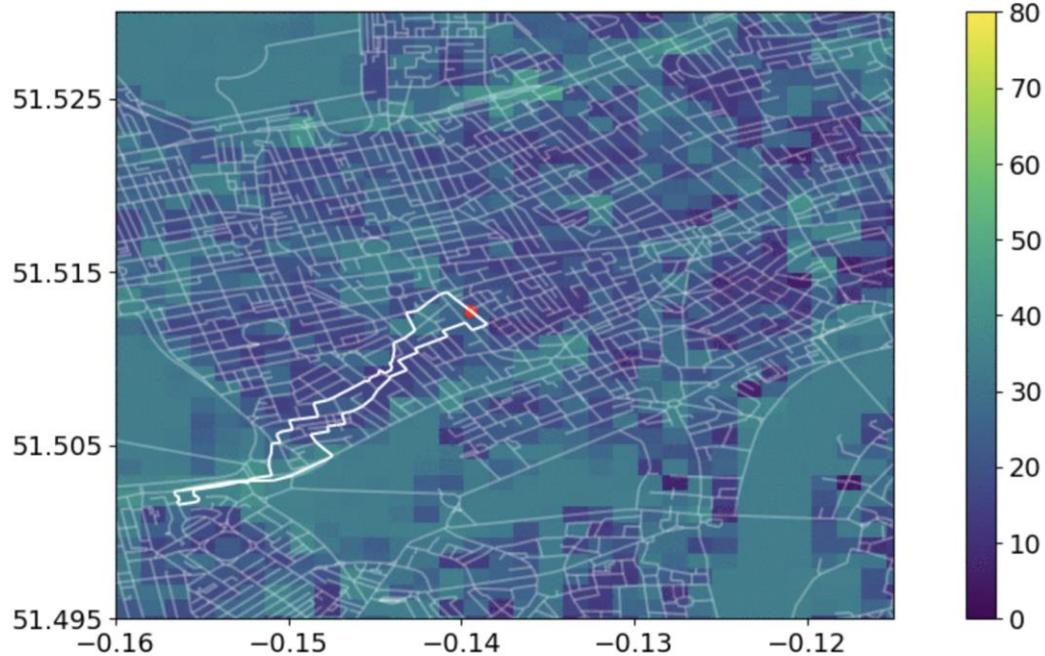
Related programmes

Data-centric engineering

Research Engineering

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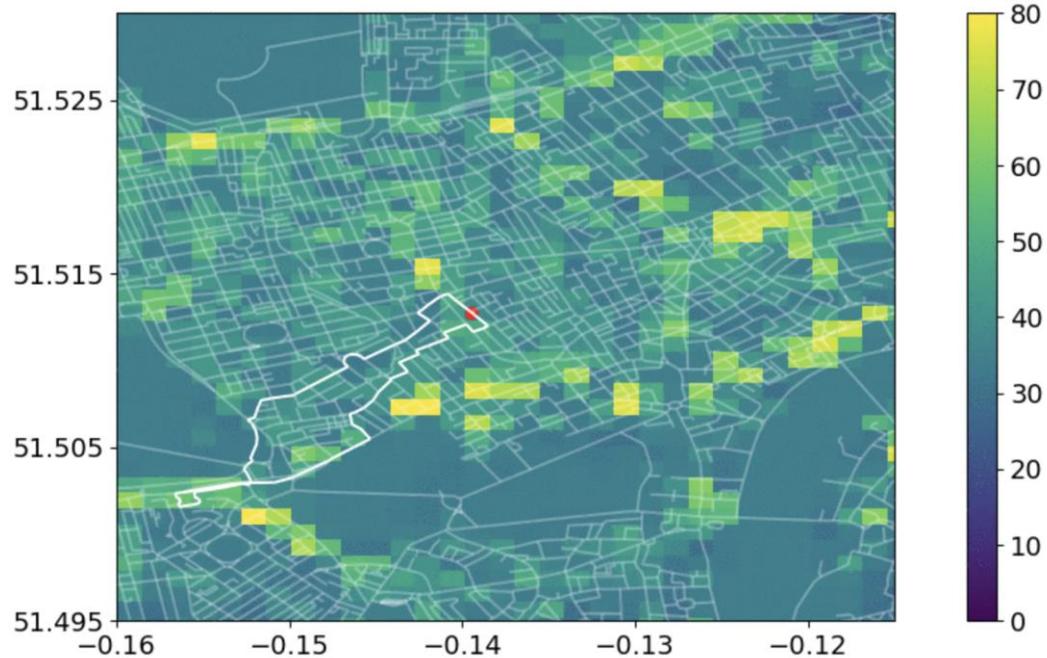
The project intends to help policymakers and citizens by predicting air quality



48 hour predictions of air quality (NO2) Central London and a running route that changes shape to minimise air pollution.

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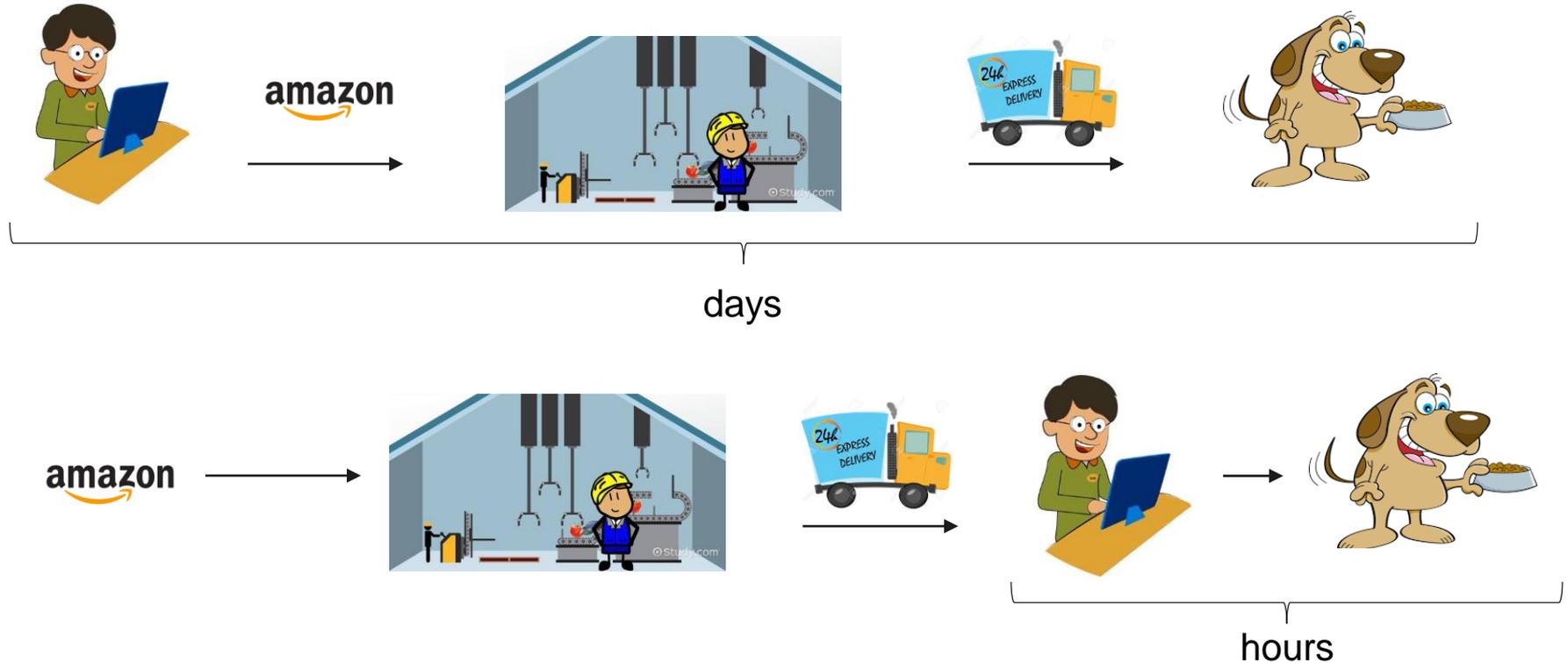
Measurement and  
detection

Prediction and  
forecasting

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governance

# Private companies are using machine learning to anticipate needs



... and personalise their services

NETFLIX

Kids

Categories ▾

Search



Exit Kids

NETFLIX ORIGINALS >



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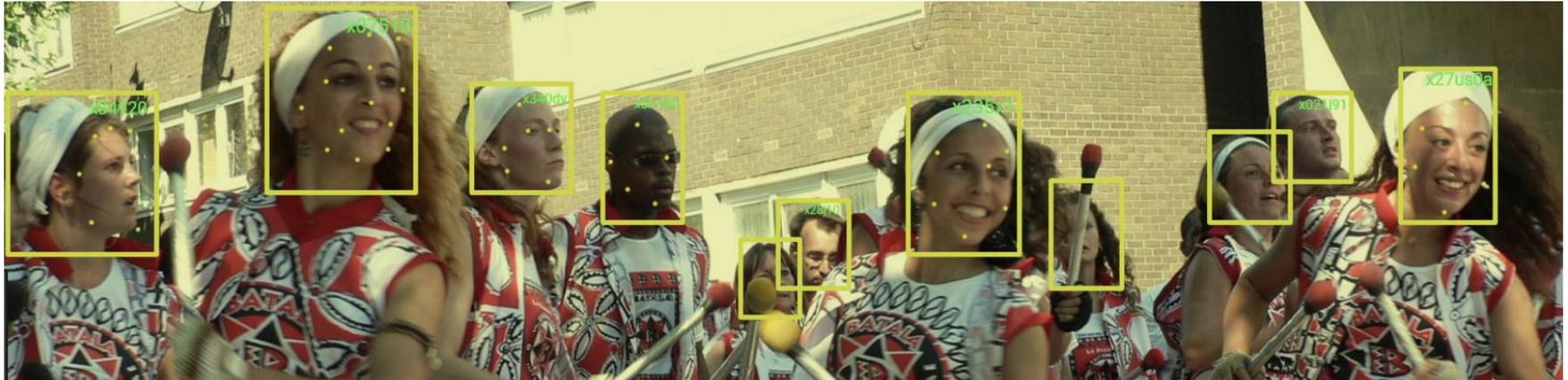
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# London's Metropolitan police used facial recognition technology at the Notting Hill Carnival in 2017



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We now know that the system performed very poorly

The Notting Hill Carnival has over **1 million** visitors. The stats for the Met's technology:

- ◆ **35** total matches
- ◆ **30** of them were clear erroneous matches
- ◆ **5** people were stopped and IDs
  - ❖ only **1** of them was an accurate match to a 'wanted' list
  - ❖ ... but the list was **out of date**. The individual was no longer wanted
  - **ZERO** success rate

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# The Information Commissioner's Office launched an investigation into police forces' use of facial recognition

**Lack of transparency  
about its use**

**Vulnerable people**

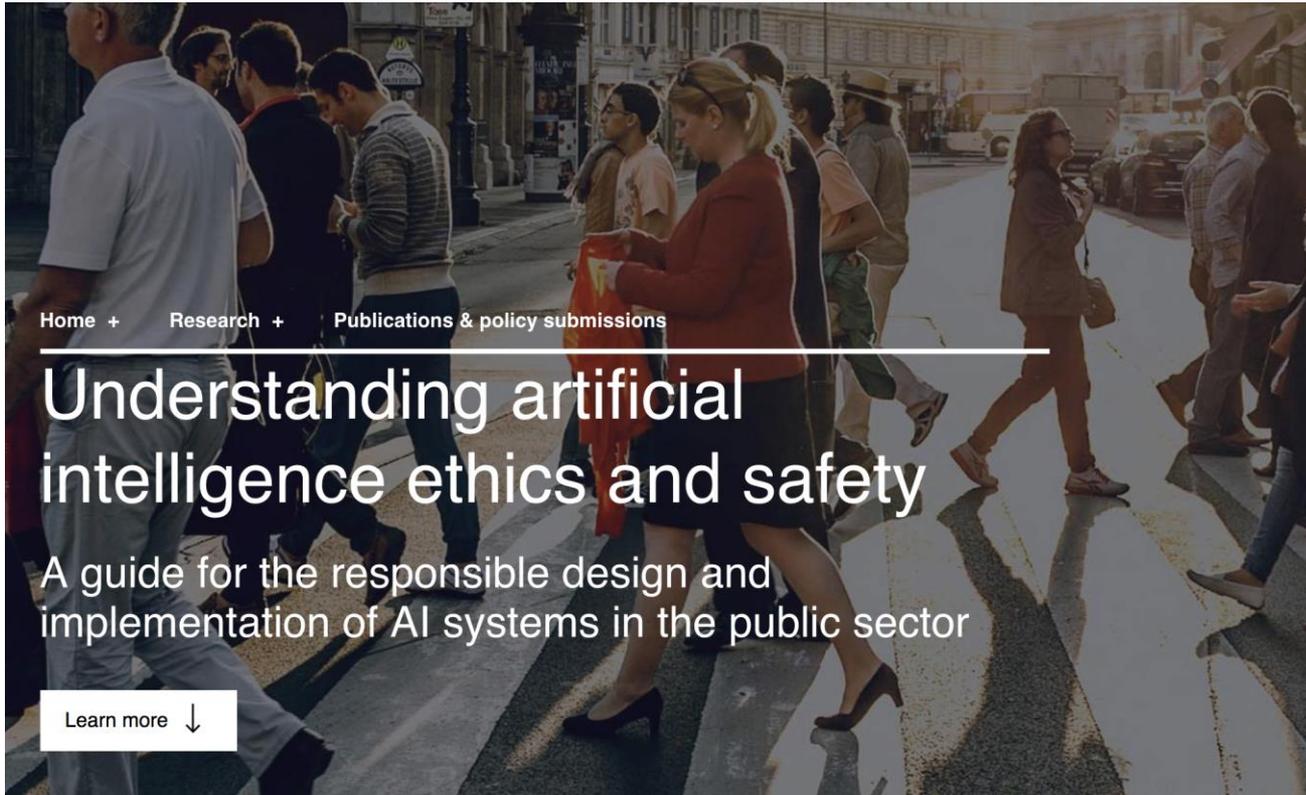
**Differential accuracy**

**Proportionality**

**How the data is  
collected and stored**

**Right to be forgotten**

# Example Turing project



Home + Research + Publications & policy submissions

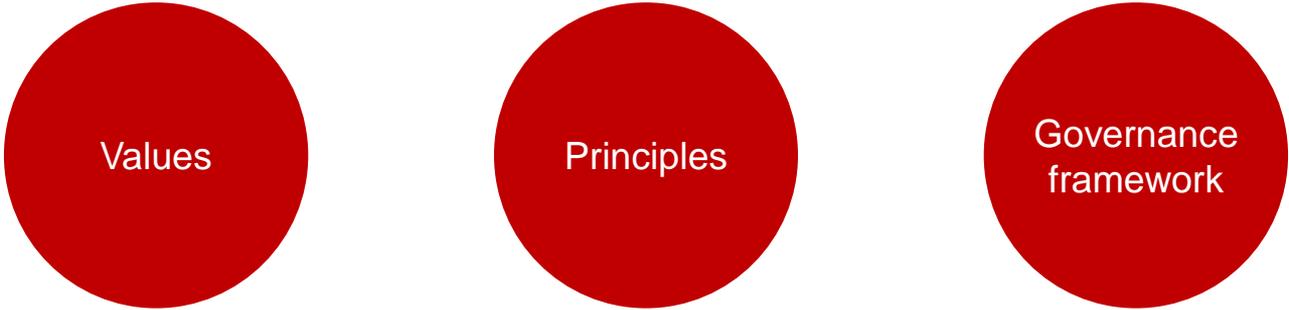
## Understanding artificial intelligence ethics and safety

A guide for the responsible design and implementation of AI systems in the public sector

Learn more ↓

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It is the most comprehensive guidance in the world on AI ethics for the public sector



Values

Principles

Governance  
framework

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# These tasks cut across all policy areas

	Simulation and evaluation	Measurement and detection	Prediction and forecasting	Personalisation	Ethics and governance
Criminal justice and home affairs					
Economic and financial affairs					
Social welfare					
Health					
Democracy and community engagement					
Environment					
Transport, energy, and telecommunications					
Education and training					

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# Agenda

- ① Why should researchers be interested in data science for policy?
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# Take home message

	Simulation and evaluation	Measurement and detection	Prediction and forecasting	Personalisation	Ethics and governance
Criminal justice and home affairs					
Economic and financial affairs					
Social welfare					
Health					
Democracy and community engagement					
Environment					
Transport, energy, and telecommunications					
Education and training					

**Huge potential**

**Up to us to help**

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Thank you!

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