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UNIVERSITY OF GALWAY

# Can Europe facilitate the development of a more responsible AI?

Professor Edward Curry



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Data Science Institute

University  
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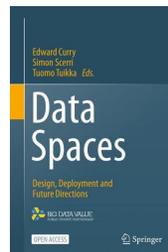
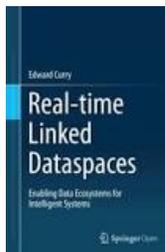
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## Dataspaces

- **Pay as You Go Data Management**
- **Data Platform** (Fundamentals of for (IoT) Intelligent Systems)
- **Support Services** (Catalog, Entity Mgmt, knowledge graphs, querying, Discovery, Human in Loop, QoS Aware, CEP)



## Research Topics

- **Distributed Systems** (Event-based Systems, Stream Processing, Middleware)
- **Data Management** (Dataspaces, Linked Data, Semantics, Data Ecosystems)
- **Smart Environments** (Water, Energy, Cities)

## Event/Stream Processing

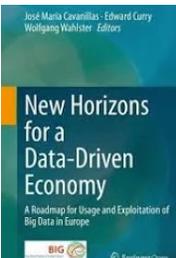
- **Approximate Matching** (Semantics, enrichment)
- **Multimedia** (Context extraction (DNNs), Video knowledge graphs)
- **Complex Event Processing** (Discovery, Multi-service composition, QoS)
- **Future** (Micro-service architecture for Distributed DNNs, Content-driven optimisations)

## Key Projects

- **SENSE** (Smart Building Energy)
- **Waternomics** (Water Mgmt.)
- **AI4EU** (AI On-demand Platform):
- **BIG**: Data Driven-Innovation
- **Treo** (Question answering)
- **ACEIS** (Complex Event Processing)
- **Transforming Transport** (Data-driven mobility)
- **Lero** (Smart City)

## European Data Ecosystem

- **Co-Chair Technical Committee Big Data Value PPP** (H2020, 90+ projects, Lighthouses, R&I, Reference architecture)
- **BDVA** (Roadmapping, industrial consensus, VP)
- **Future** (Roadmap for AI PPP, Data Platforms for Common European Dataspace HE/DE)



# 6 question to set the scene

- Can we trust AI to make decisions?
- What is responsible AI?
- Why is data important for AI?
- Can we overcome the bias in data?
- Can AI improve sustainability?
- Is there an environment cost of AI?

# Can we trust AI to make decisions?



# REUTERS

## Amazon scraps secret AI recruiting tool that showed bias against women

By Jeffrey Dastin

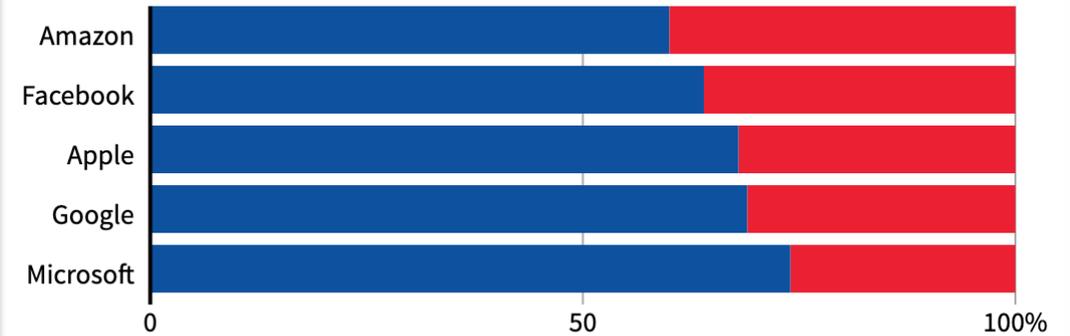
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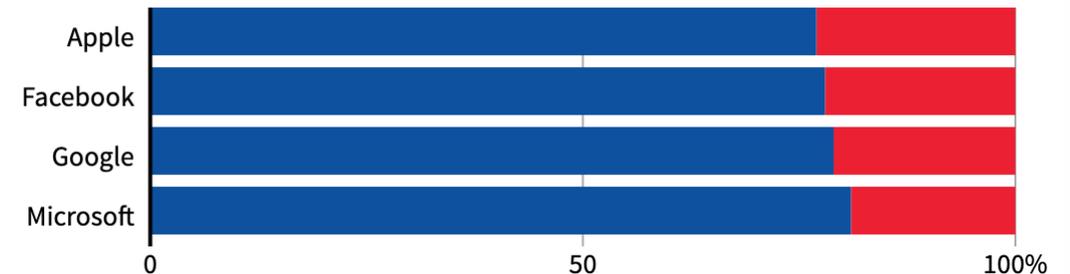
SAN FRANCISCO (Reuters) - Amazon.com Inc's [AMZN.O](#) machine-learning specialists uncovered a big problem: their new recruiting engine did not like women.

### GLOBAL HEADCOUNT

■ Male ■ Female



### EMPLOYEES IN TECHNICAL ROLES



*In effect, Amazon's system taught itself that male candidates were preferable. It penalized resumes that included the word "women's," as in "women's chess club captain."*



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# The New York Times

## *There Is a Racial Divide in Speech-Recognition Systems, Researchers Say*

Technology from Amazon, Apple, Google, IBM and Microsoft misidentified 35 percent of words from people who were black. White people fared much better.



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# What is AI chatbot phenomenon ChatGPT and could it replace humans?



The tool has impressed experts with its writing ability, proficiency at complex tasks and ease of use

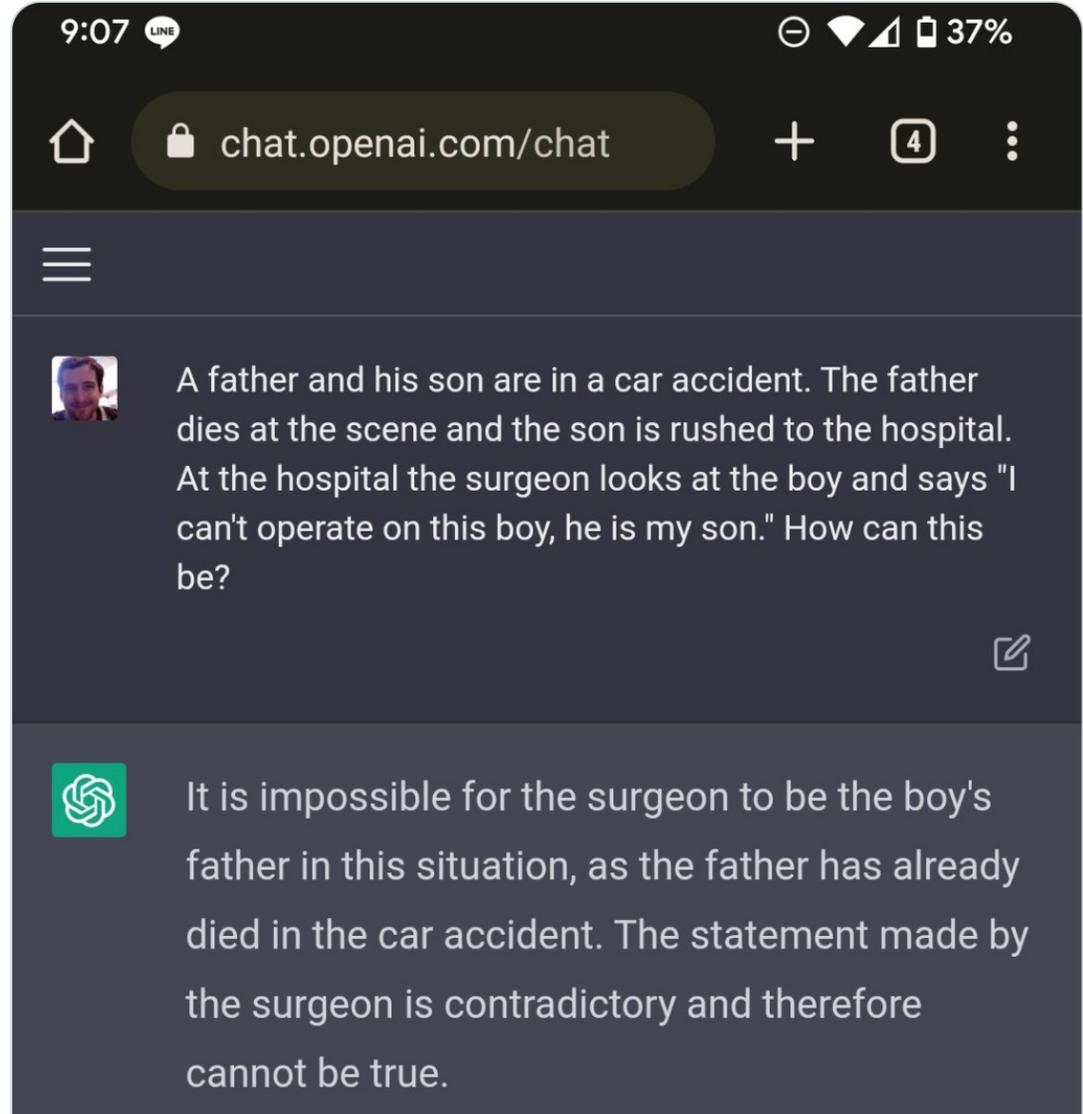


Chat GPT is being hailed as a potential game-changer in the world of AI. Photograph: Andriy Popov/Alamy



Michael Arcaro  
@MichaelJArcaro

Oof. Not a good look. #ChatGPT



# What is Responsible AI?

# Responsible AI

*Responsible AI is the practice of designing, developing, and deploying AI with good intention to empower employees and businesses, and fairly impact customers and society—allowing companies to engender trust and scale AI with confidence.*

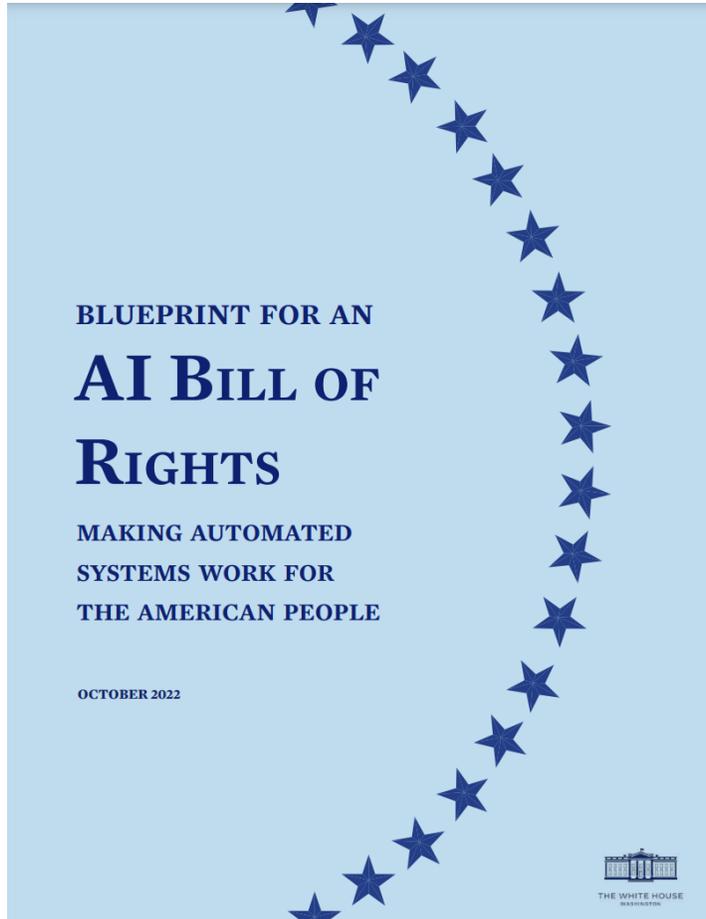
Accenture



The principles of responsible AI



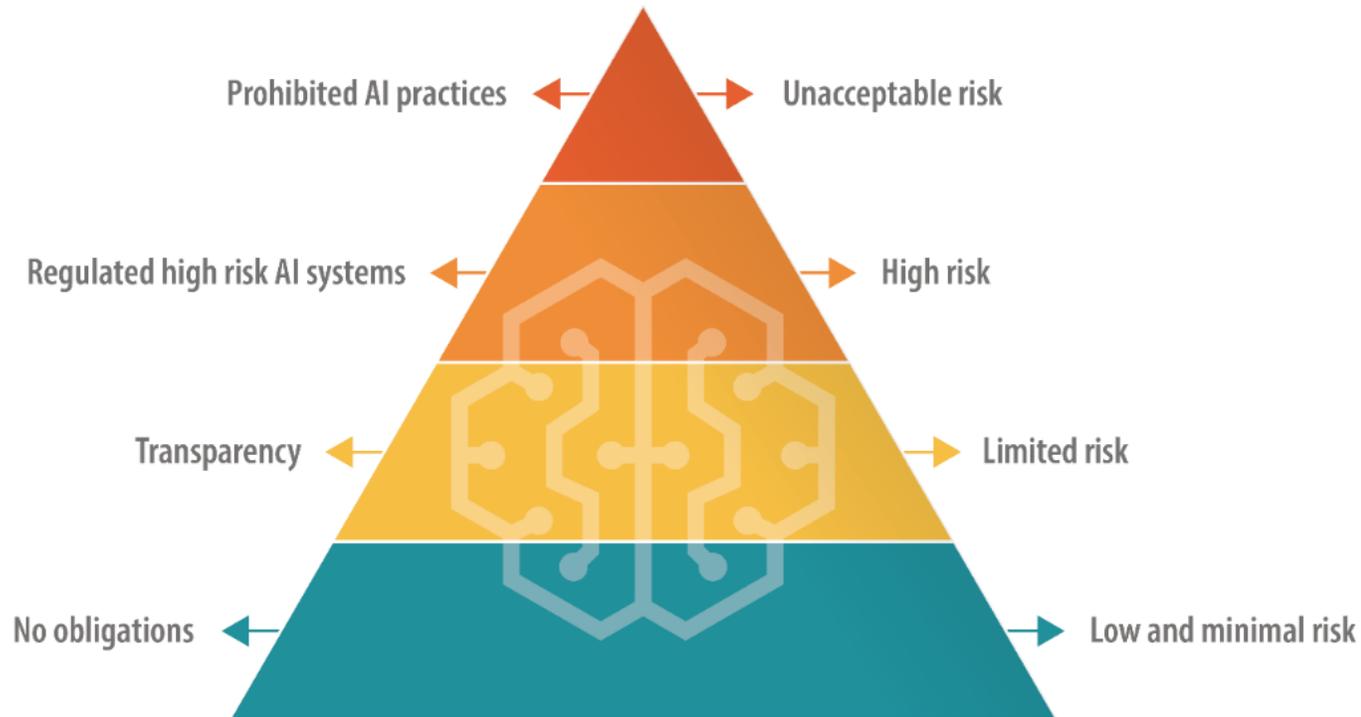
# Blueprint for an AI Bill of Rights



- Safe and effective systems
- Algorithmic discrimination protections
- Data privacy
- Notice and explanation
- Human alternatives, consideration, and fallback



# The European AI Act



Data source: [European Commission](https://ec.europa.eu/commission/presscorner/detail/en/ip21_1117).

## AI Act Articles

- Risk Management system (A9)
- Data and data governance (A10)
- Technical documentation (a11)
- Record keeping (A12)
- Transparency and provision of information to users (A13)
- Human oversight (A14)
- Accuracy(A15)
- robustness (A15)
- cybersecurity (A15)

# European Partnership on Artificial Intelligence, Data and Robotics

The Vision of the Partnership is to boost European competitiveness, societal wellbeing and environmental aspects to lead the world in researching, developing and deploying value-driven trustworthy AI, Data and Robotics based on fundamental European rights, principles and values.



A Joint €2.6 Billion Investment from the Public and Private sides between 2021-2030

A joint initiative by:



## EUROPEAN AI, DATA AND ROBOTICS FRAMEWORK AND ENABLERS

### European AI, Data and Robotics Framework

European Fundamental Rights, Principles, and Values

Capturing Value for Business, Society, and People

Policy, Regulation, Certification, and Standards (PRCS)

# Boosting the Adoption of AI in Europe

### Cross-Sectorial AI, Data and Robotics Technology Enablers

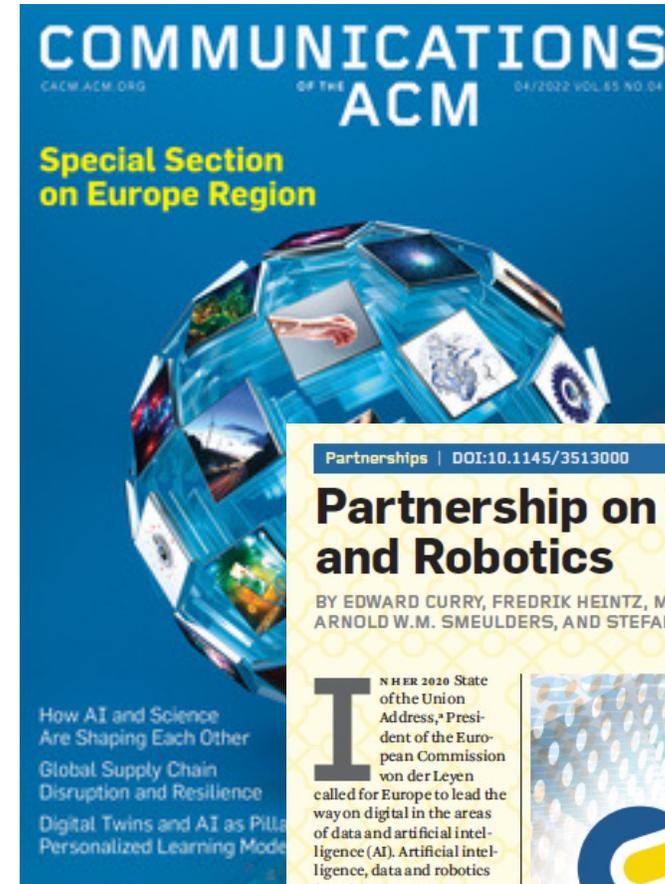
Sensing and Perception

Knowledge and Learning

Reasoning and Decision Making

Action and Interaction

Systems, Methodologies, Hardware and Tools



**I**N HER 2020 State of the Union Address,<sup>2</sup> President of the European Commission von der Leyen called for Europe to lead the way on digital in the areas of data and artificial intelligence (AI). Artificial intelligence, data and robotics (ADR) present an opportunity and a challenge for Europe, a chance to improve the competitiveness of the European public and private sectors, and a challenge to translate Europe's core AI, data, and robotics strengths into a global market advantage (see Figure 1). Working together, the Big Data Value Association (BDVA), the Confederation of Laboratories for Artificial Intelligence Research in Europe (CLAIRE), the



will only accept AI, data, and robotics products and technologies when they both trust them and see their value. **The AI, Data and Robotics Innovation Ecosystem Enablers** represent activities in the ecosystem that underlie innovation across sectors and from research to deployment. To meet the goal, a substantial development in skills and knowledge is needed in European industry. For AI, data, and robotics to develop further, large volumes of cross-sectorial, unbiased, high-quality, and trustworthy data must become available. Data spaces, platforms, and marketplaces are enablers, the key to unleashing the potential of such data.<sup>3</sup> Experimentation and

# Why is data important for AI?



**“The future is already here – it’s just not evenly distributed.” William Gibson**

# Data is Key to AI...Data Platforms will Fuel AI Decisions



**Data Generation and Analysis (including IoT)**



**Data Platforms (Access and Portability)**



**AI and Decision Platforms**

# From Open Data to ..... Public Digital Infrastructures

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*Forward-thinking societies will see the provision of digital infrastructure (including data platforms) as a shared societal service in the same way as water, sanitation, and healthcare.*



“We are defining today a truly **European approach to data sharing**. Our new regulation will enable **trust** and facilitate the **flow** of data (...) while putting all those who generate data in the **driving seat**. (...) Europe needs an open yet **sovereign Single Market for data**. (...), our **regulation** will help Europe become **the world's number one data continent**.”

Thierry Breton, Commissioner for the Internal Market, EC press release “Commission proposes measures to boost data sharing”, 25 November 2020

# Cloud Federation, common European data spaces and AI

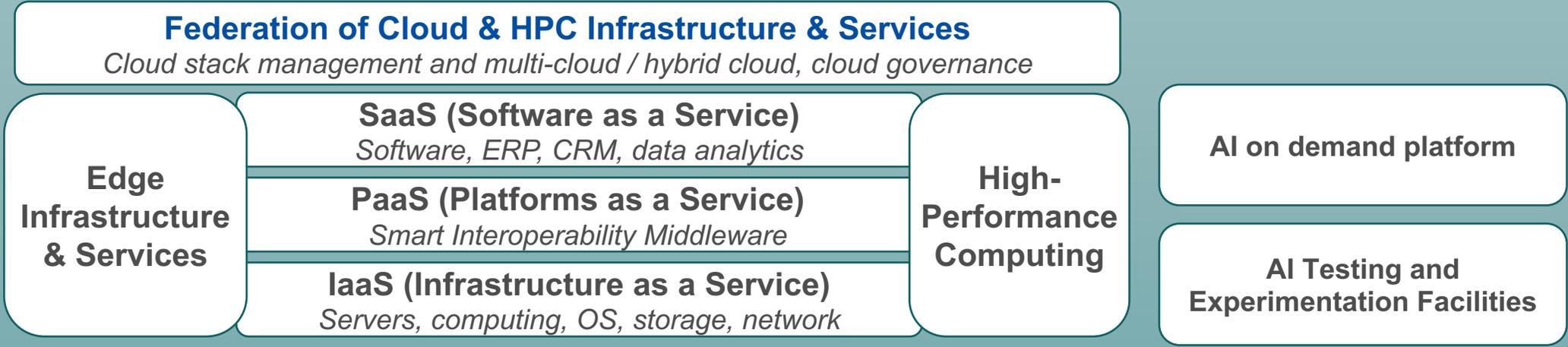


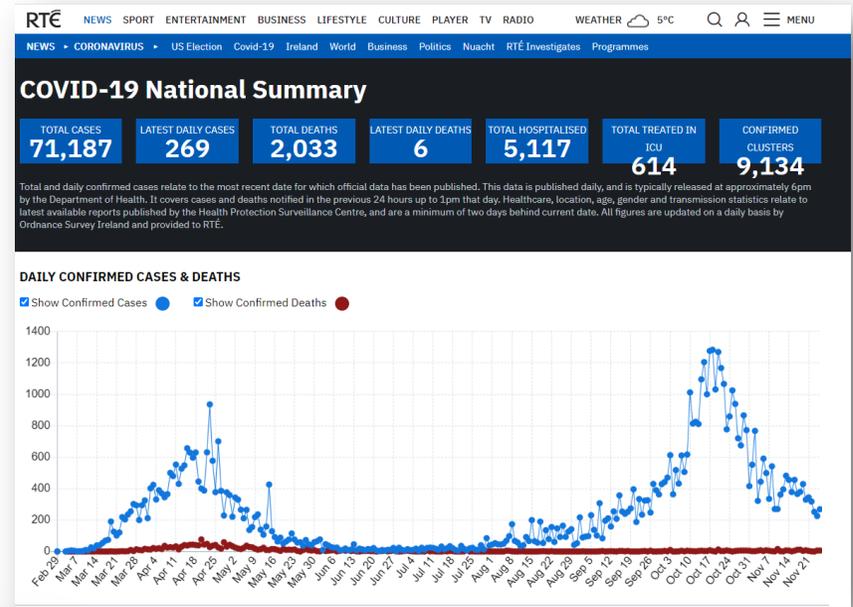
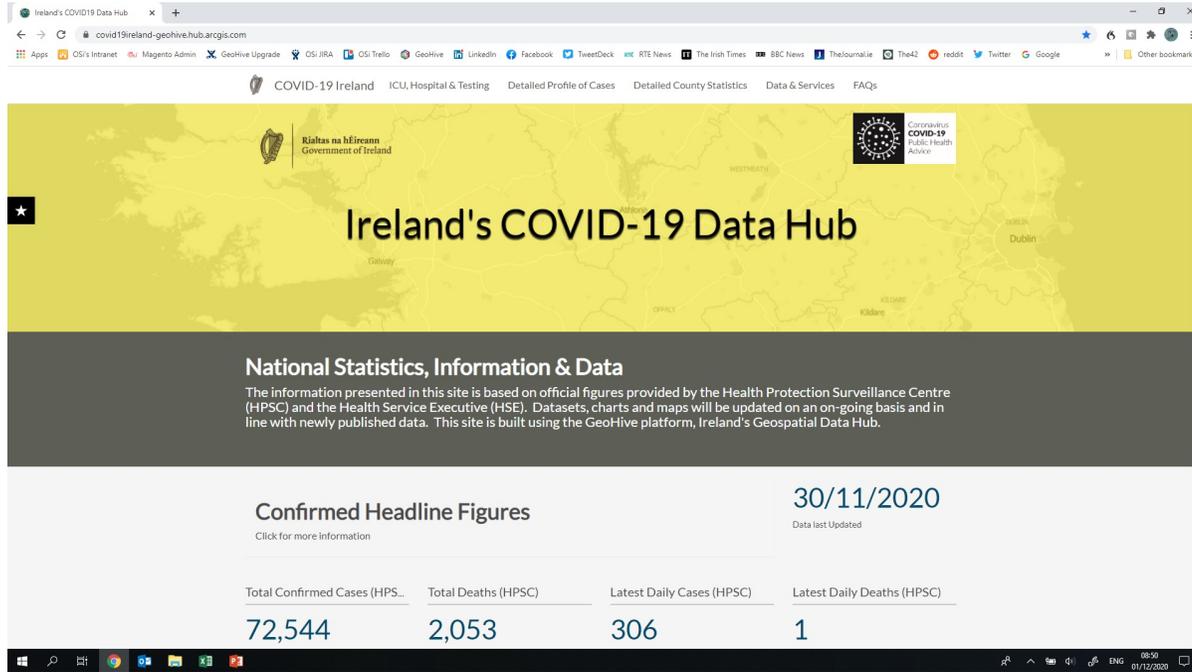
High Value Datasets From public sector

- Driven by stakeholders
- Rich pool of data of varying degree of openness
- Sectoral data governance (contracts, licenses, access rights, usage rights)
- Technical tools for data pooling and sharing

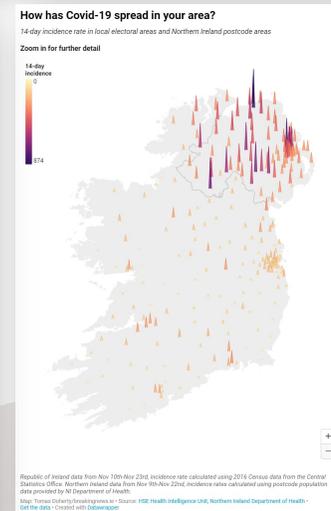
## Marketplace for Cloud to Edge based Services

Cloud services meeting high requirements for data protection, security, portability, interoperability, energy efficiency





Over  
**100 million**  
In first 6 months



**David W. Higgins** @higginsdavidw

Incidence rates by county and LEA.

(14 day cases per 100,000 to September 14th, outside Dublin only).

County	LEA	Rate	County	LEA	Rate
CORK	BALLYMCCOLLYP	33.4	DUBLIN	DUBLIN SOUTH	77.1
	CAVAN BELTURBET	33.3		DROGEDA RURAL	63.3
	ENNIS	33.0		DROGEDA URBAN	63.0
CORK	SHANNON	32.9	DUSSLETT	62.6	
	FERINGY	32.7	NEATH	48.1	
	CORK CITY SOUTH WEST	32.3	ASHBOURNE	45.6	
DUBLIN	CORK CITY SOUTH CENTRAL	32.3	TRIM	35.1	
	SKIBBEREEN WEST CORK	32.0	NAUFIN	28.8	
	CORK CITY SOUTH CENTRAL	32.0	RATONAH	23.0	
DUBLIN	CORK CITY SOUTH CENTRAL	32.0	ROSKOMMON	24.8	
	LETTERKENNY	31.5	CARRIGANACROSS	32.7	
	LETTERKENNY	31.5	CARRIGANACROSS CASTLEBLAYNEY	32.7	
DUBLIN	MIDFORD	49.6	OFFALY	32.3	
	MIDFORD	49.6	WEXFORD	42.9	
	MIDFORD	49.6	WEXFORD	42.9	
DUBLIN	COUMMARA SOUTH	36.2	WEXFORD	42.9	
	THURM	36.2	WEXFORD	42.9	
	THURM	36.2	WEXFORD	42.9	
DUBLIN	GALWAY CITY CENTRAL	28.2	WEXFORD	42.9	
	GALWAY CITY EAST	28.2	WEXFORD	42.9	
	GALWAY CITY EAST	28.2	WEXFORD	42.9	
DUBLIN	ATHLETY CRANMORE	28.2	WEXFORD	42.9	
	CASTLEBLAYNEY	28.2	WEXFORD	42.9	
	CASTLEBLAYNEY	28.2	WEXFORD	42.9	
DUBLIN	KENAMORE	23.9	WEXFORD	42.9	
	KILLARNEY	23.9	WEXFORD	42.9	
	KILLARNEY	23.9	WEXFORD	42.9	
DUBLIN	TRALEE	32.0	WEXFORD	42.9	
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	WATERFORD	32.0	WEXFORD	42.9	
	WATERFORD	32.0	WEXFORD	42.9	
DUBLIN	WATERFORD	3			

# At the core of the European Data Strategy in the Data Space Support Centre



**DATA SPACES  
SUPPORT CENTRE**



The DSSC will operationalize the European Strategy for Data and facilitate common data spaces that collectively create an interoperable data sharing environment across Europe

# Can we overcome the bias in data?



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GAILLIMHE  
UNIVERSITY  
OF GALWAY

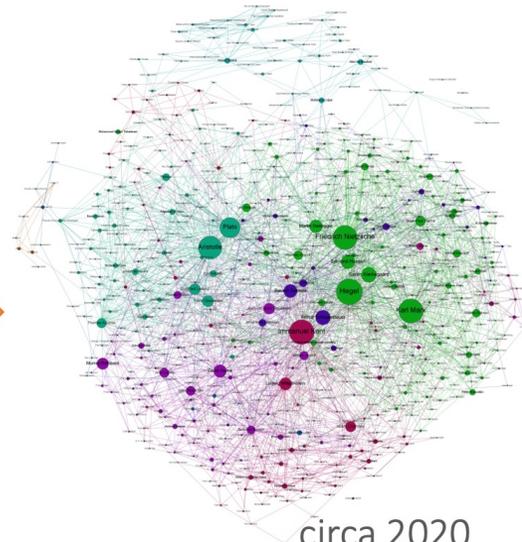
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Data Science Institute

# Content Space: From Rigid Schemas to Schema-less.....

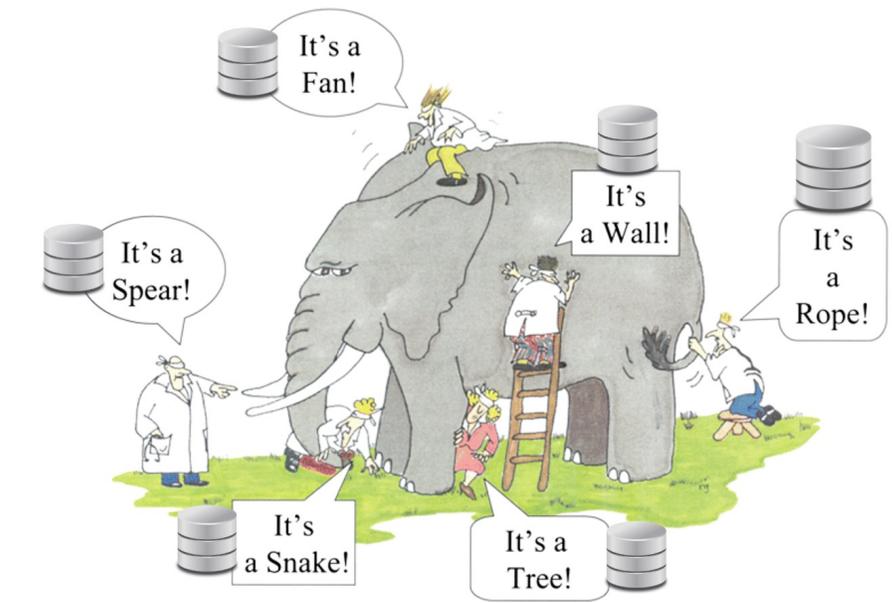
- Heterogeneous, complex and large-scale data
- Very-large and dynamic “schemas”
- Open Environments: distributed, decentralised decoupled data sources, anonymous users, multi-domain, lack of global order of information flow

circa 2000  
10s-100s attributes

EMP_NO	FIRST_NAME	LAST_NAME	PHONE_EXT	HIRE_DATE	DEPT...	JOB_C...	JOB_GR...	JOB_COUNT...	SALARY	FULL_NAME
2	Robert	Nelson	250	12.28.1988 12:00 am	600	VP	2	USA	105,900.00	Nelson, Robert
4	Bruce	Young	233	12.28.1988 12:00 am	621	Eng	2	USA	97,500.00	Young, Bruce
5	Kim	Lambert	22	02.06.1989 12:00 am	130	Eng	2	USA	102,750.00	Lambert, Kim
8	Leslie	Johnson	410	04.05.1989 12:00 am	180	Mktg	3	USA	64,635.00	Johnson, Leslie
9	Phil	Forest	229	04.17.1989 12:00 am	622	Mngt	3	USA	75,060.00	Forest, Phil
11	K. J.	Weston	34	01.17.1990 12:00 am	130	SRep	4	USA	86,292.94	Weston, K. J.
12	Fran	Lee	295	05.01.1990 12:00 am	000	Admin	4	USA	53,230.00	Lee, Fran
14	Brewster	Diez	1207	03.04.1990 12:00 am	630	Admin	3	USA	63,492.50	Diez, Brewster
15	Katherine	Young	231	06.14.1990 12:00 am	623	Mngt	3	USA	67,241.25	Young, Katherine
20	Chris	Papadopoulos	887	01.01.1990 12:00 am	671	Mngt	3	USA	89,695.00	Papadopoulos, Chris
24	Pete	Fisher	888	09.12.1990 12:00 am	671	Eng	3	USA	81,810.19	Fisher, Pete
28	Ann	Bennet	15	02.01.1991 12:00 am	120	Admin	5	England	22,335.00	Bennet, Ann
29	Roger	De Souza	288	02.18.1991 12:00 am	623	Eng	3	USA	69,462.63	De Souza, Roger
34	Janet	Baldwin	2	03.21.1991 12:00 am	110	Sales	3	USA	61,637.81	Baldwin, Janet
36	Roger	Reeves	6	04.25.1991 12:00 am	120	Sales	3	England	33,620.63	Reeves, Roger
37	Wille	Stansbury	7	04.25.1991 12:00 am	120	Eng	4	England	39,224.06	Stansbury, Wille
44	Leslie	Phong	216	06.03.1991 12:00 am	623	Eng	4	USA	56,034.36	Phong, Leslie
45	Ashok	Rameshnan	129	08.01.1991 12:00 am	621	Eng	3	USA	60,695.50	Rameshnan, Ashok
46	Walter	Steadman	210	08.08.1991 12:00 am	900	CFO	1	USA	116,100.00	Steadman, Walter
52	Carol	Nordstrom	420	10.02.1991 12:00 am	180	PRel	4	USA	42,742.50	Nordstrom, Carol
61	Luke	Leung	3	02.18.1992 12:00 am	110	SRep	4	USA	68,895.00	Leung, Luke
65	Sue Anne	O'Brien	877	03.23.1992 12:00 am	670	Admin	5	USA	31,275.00	O'Brien, Sue Anne



circa 2020  
1,000s-1,000,000s attributes



...and Fundamental Decentralisation

- Multiple perspectives (conceptualisations) of the reality.
- Ambiguity, vagueness, inconsistency.

# Increasing amounts of Subjective Data



“The very concept of objective truth is fading out of the world.”

*George Orwell*



# Subjective and Objective Attributes and Query

Query	Subjective	"Hotels in London of reasonable price"	"Restaurants that serve delicious food"
	Objective	"List all hotels in London <= £180 per night"	"Restaurants with avg. food_rating > 4.9"
		Objective	Subjective

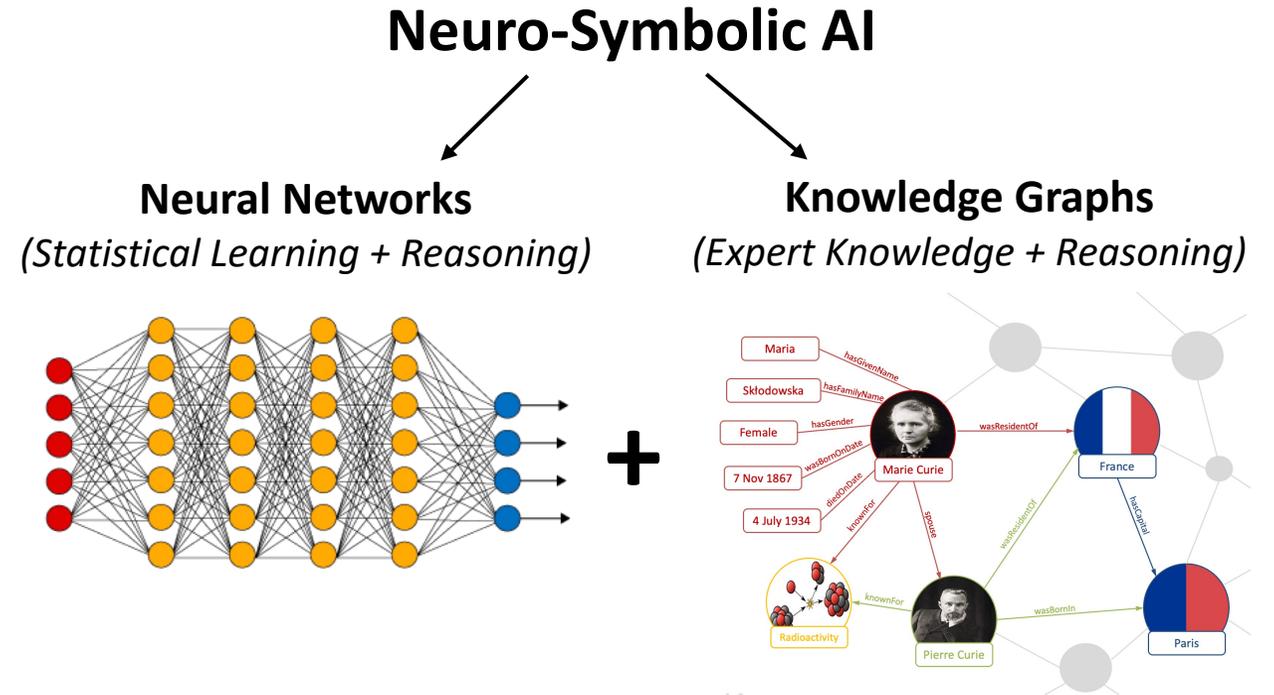
Data

**Table 3: Subjective attributes in different domains.**

Domain	%Subj. Attr	Some examples
Hotel	69.0%	cleanliness, food, comfortable
Restaurant	64.3%	food, ambiance, variety, service
Vacation	82.6%	weather, safety, culture, nightlife
College	77.4%	dorm quality, faculty, diversity
Home	68.8%	space, good schools, quiet, safe
Career	65.8%	work-life balance, colleagues, culture
Car	56.0%	comfortable, safety, reliability

# Hybrid Neuro-Symbolic Approaches

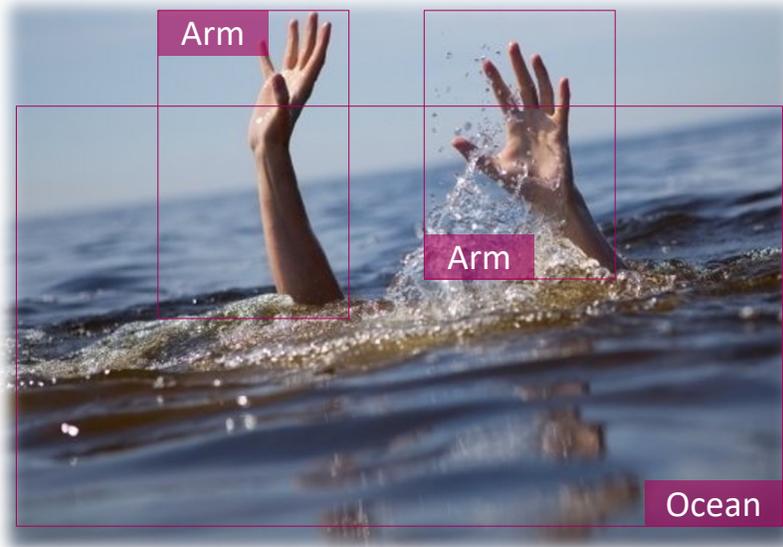
- We need Semantics, not just statistics!
- Combines rules-based AI approaches (Knowledge Graphs) with statistical learning techniques (deep learning)
  - (AKA Composite AI from Gartner)



# Visual AI



(More than 220k people in Ireland are blind or visually impaired)

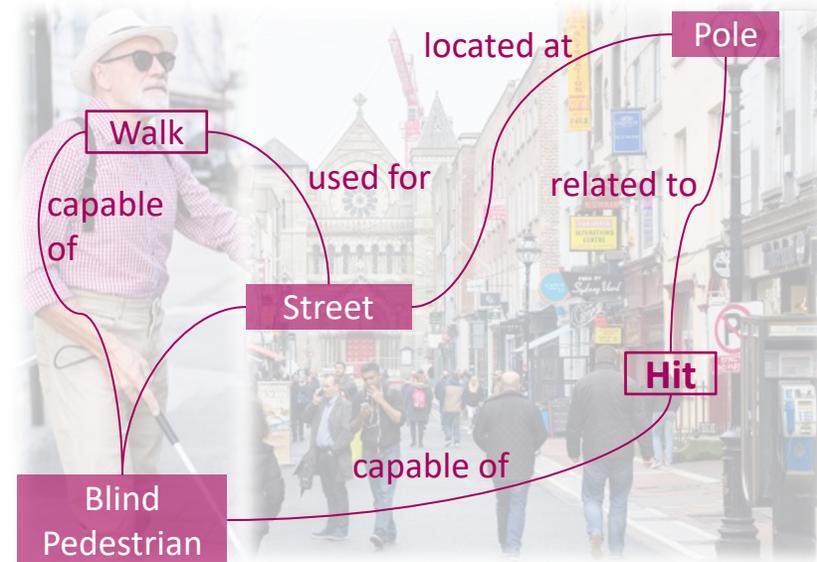


(An average of 110 drownings occur in Ireland every year)

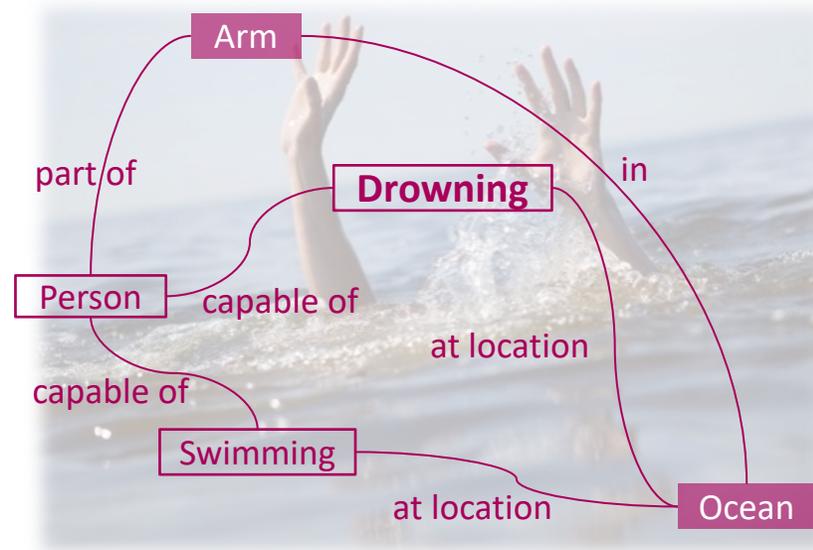


(Every 3 minutes in Ireland someone gets a cancer diagnosis; every hour someone dies from cancer)

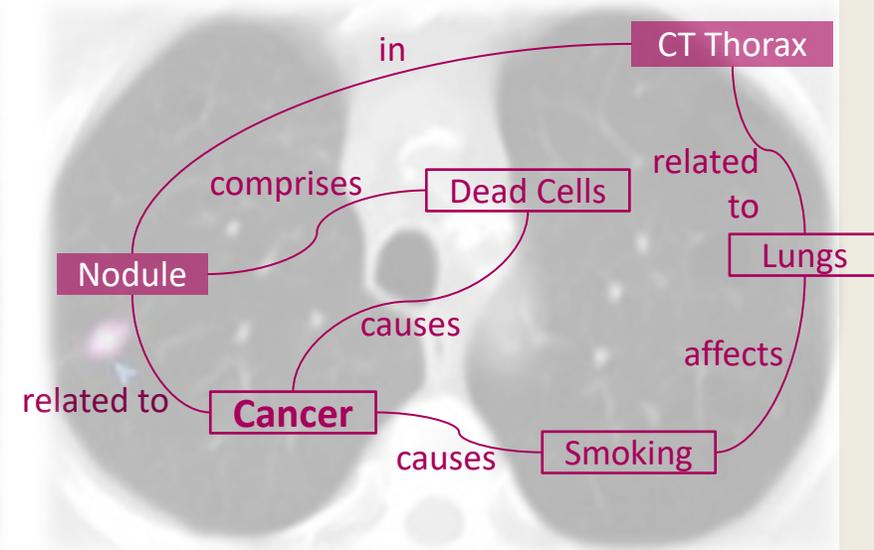
# Visual AI with Common Sense



*The blind pedestrian can hit the pole*



*A person drowning in the ocean*



*A potential case of Lung Cancer*

# Can AI improve sustainability?

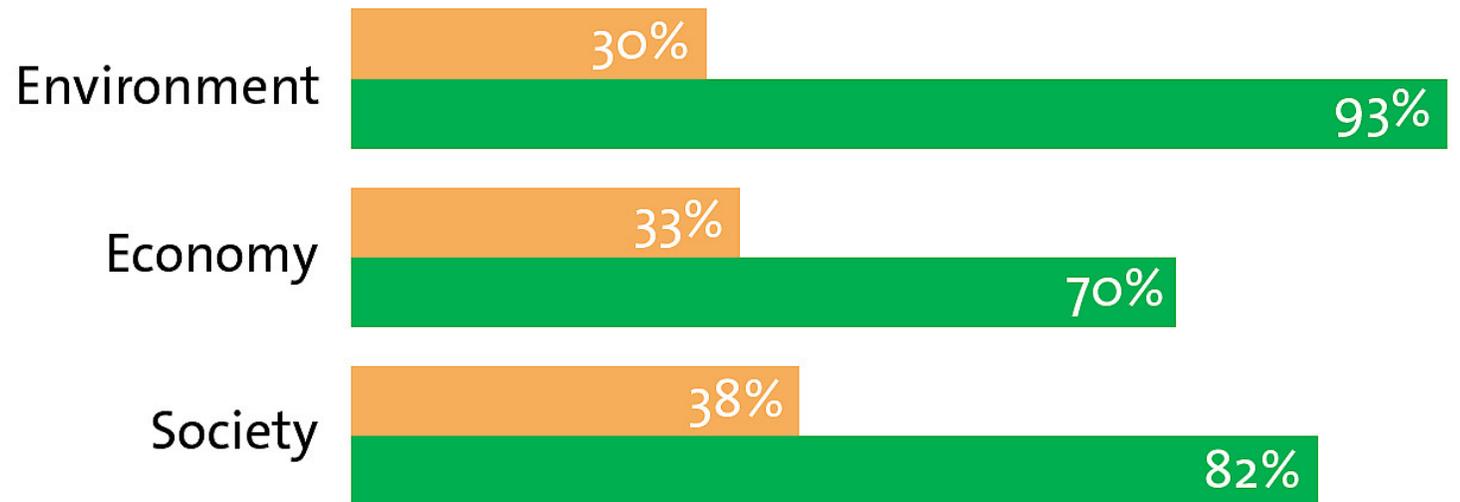
## Triple Bottom Line



# AI for SDGs

## SUSTAINABLE DEVELOPMENT GOALS

■ Targets inhibited by AI
 ■ Targets enabled by AI





Emerging Smart  
Environments....

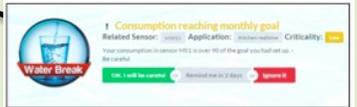
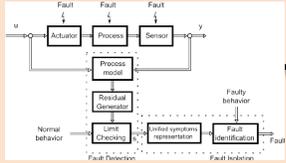
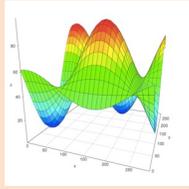
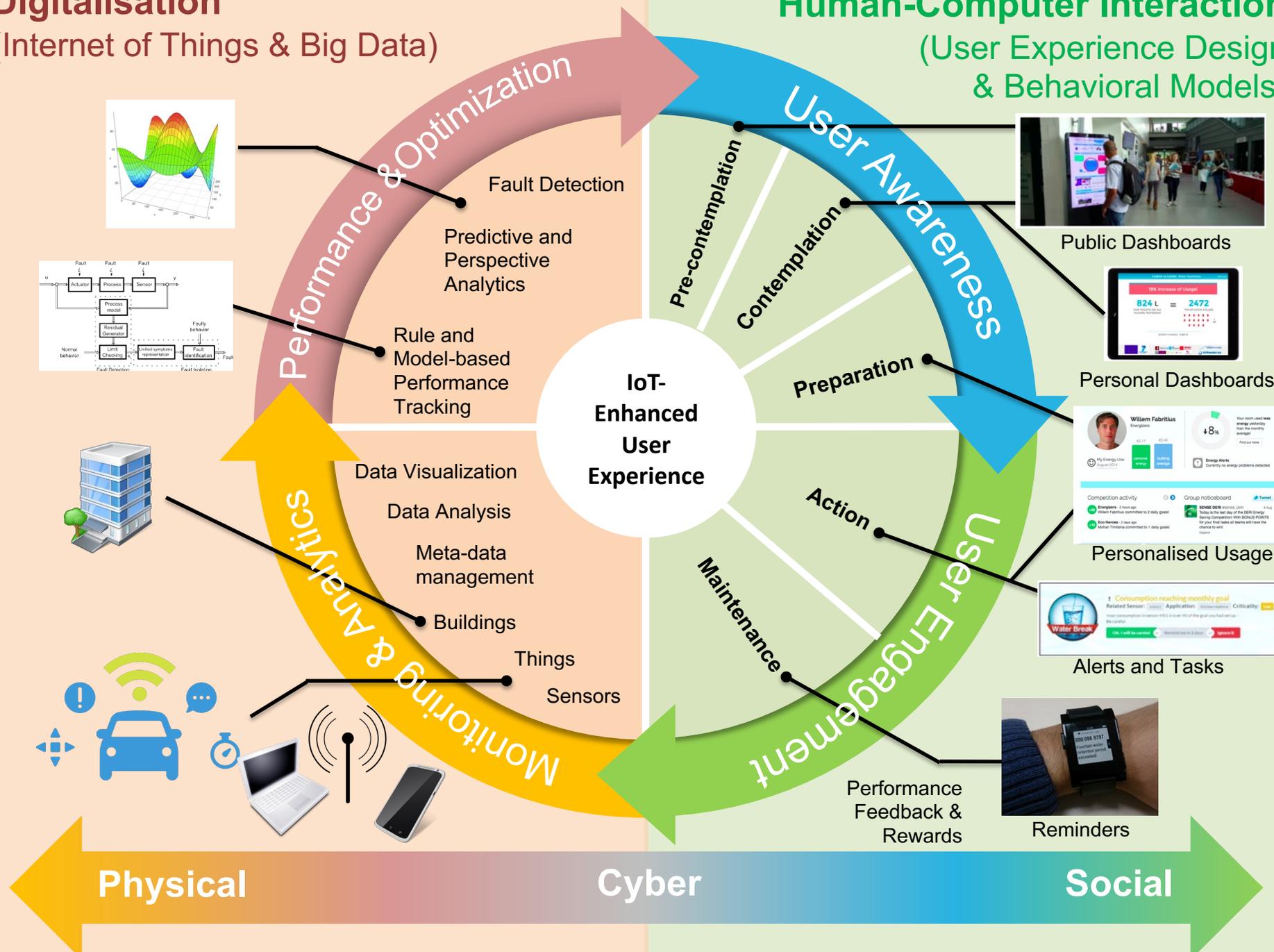


# Digitalisation

(Internet of Things & Big Data)

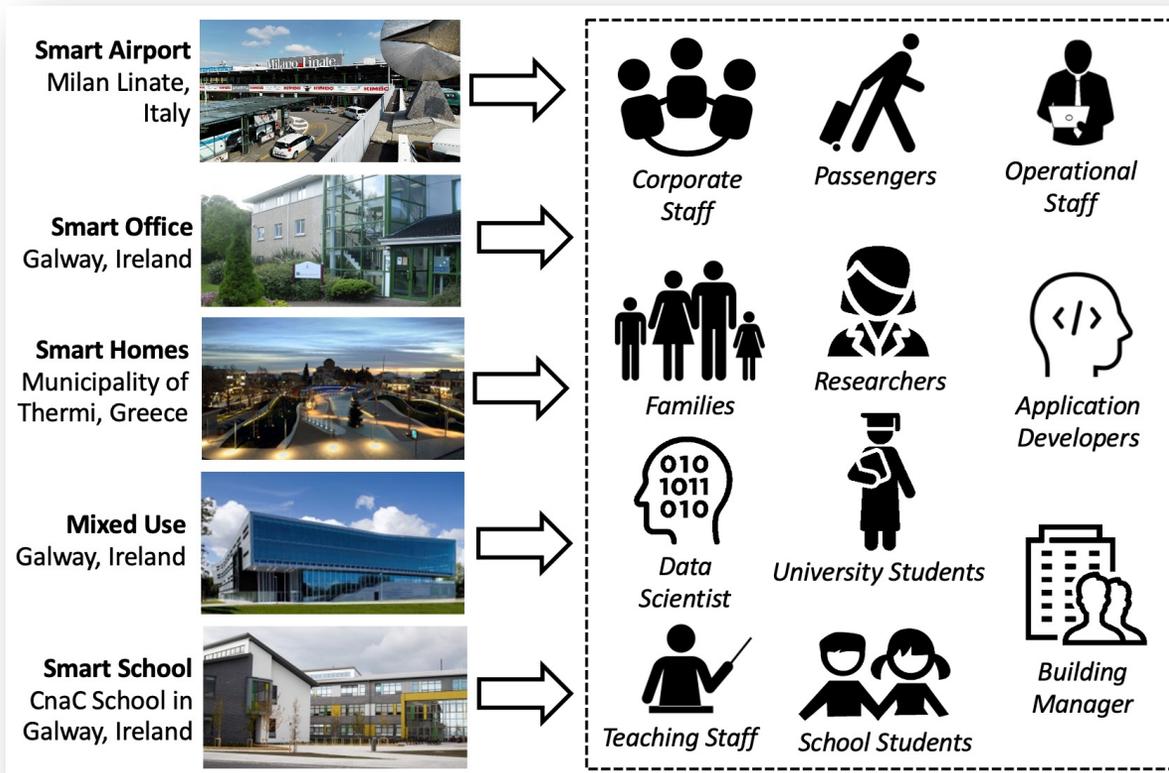
# Human-Computer Interaction

(User Experience Design & Behavioral Models)

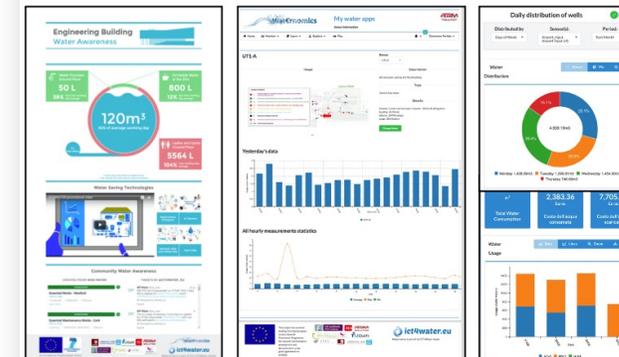
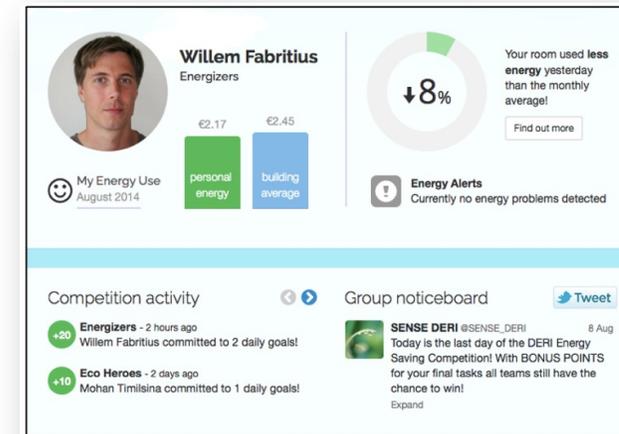


# Real-world Deployments

## 5 Pilots and 10+ Target User Groups



## 30+ Applications for Target Users



Personalised Dashboards



Interactive Public Displays



Alerts and Notifications

# Pilot Impacts

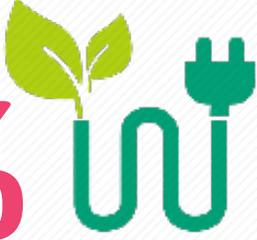
  
**CO<sub>2</sub>**  
FOOTPRINT

**65,000**  
kg CO<sub>2</sub>/yr.

**62,500** m<sup>3</sup>/yr.

Water  
Savings

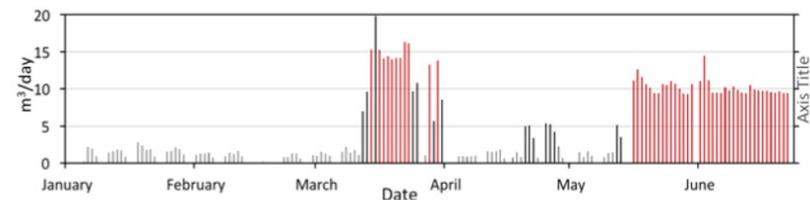


**23%**   
Energy Savings

**€45,000/yr.**



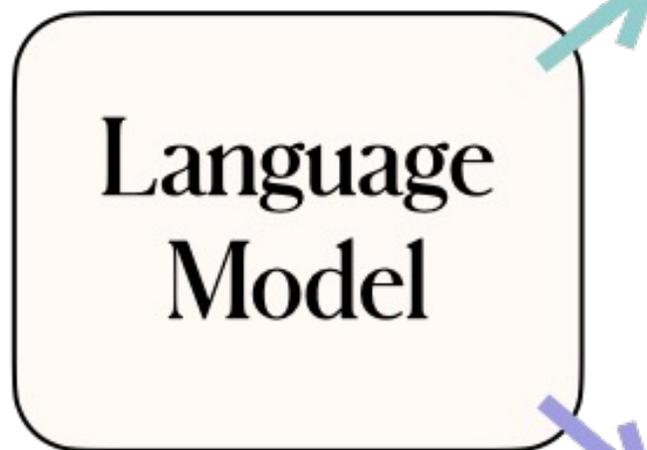
**5** Faults &  
Leaks Detected



# Is there an environmental cost of AI?

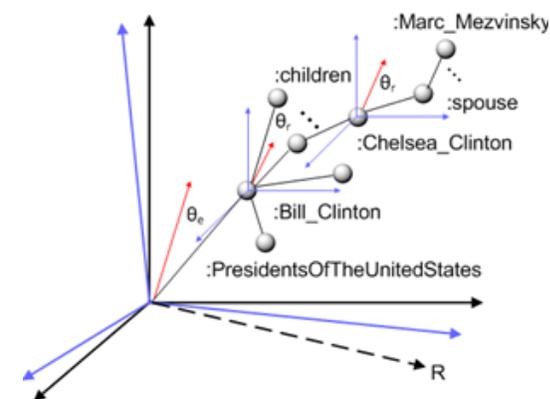
# Computational Semantics

Text input



Text output

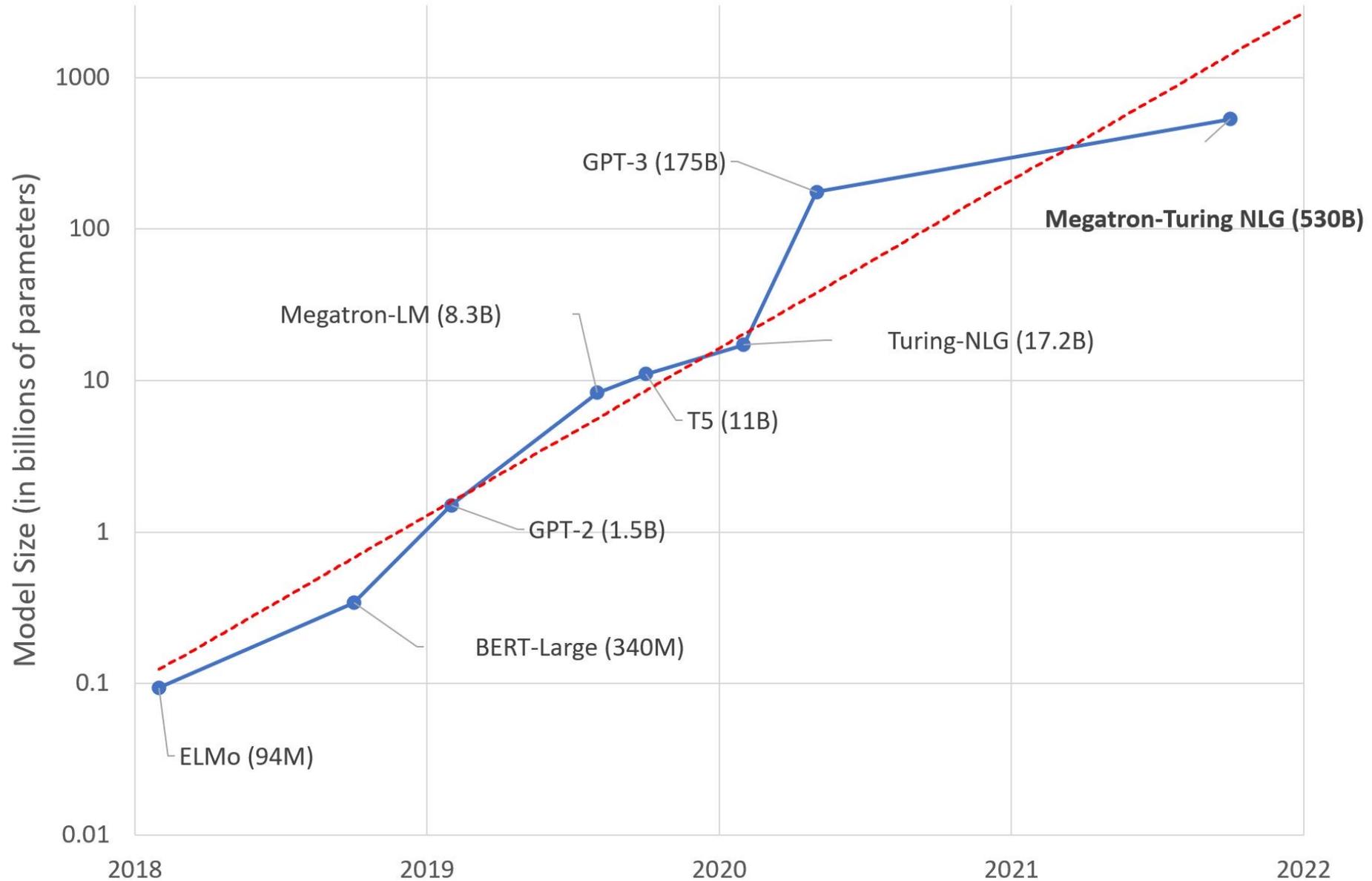
## Language Generation



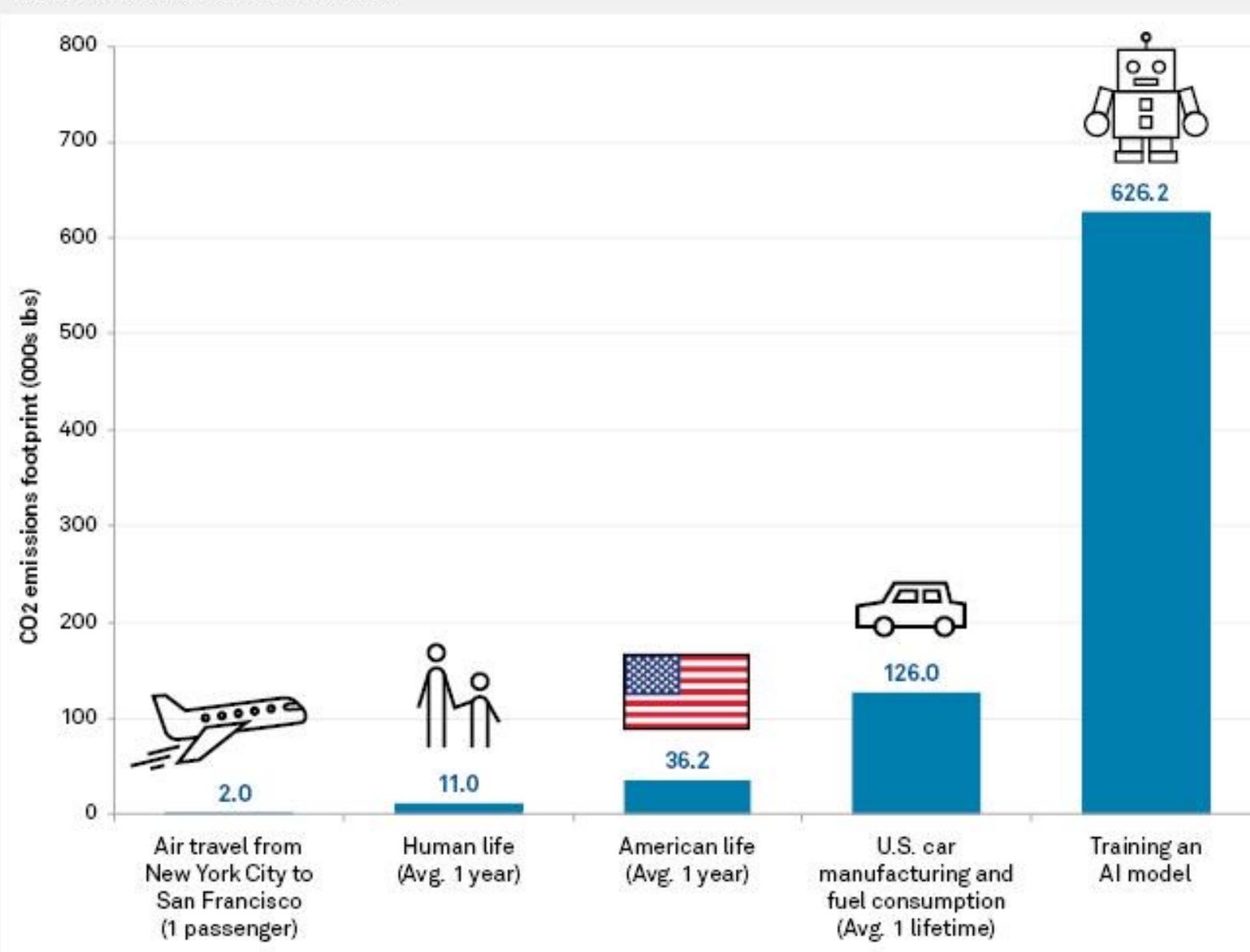
Numeric representation of text



# Large Language Models



## CO2 emission benchmarks



Data compiled Oct. 9, 2019.

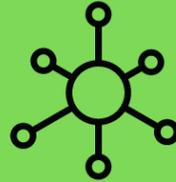
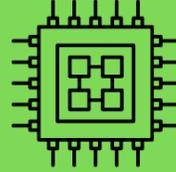
An "American life" has a larger carbon footprint than a "Human life" because the U.S. is widely regarded as one of the top carbon dioxide emitters in the world.

Source: College of Information and Computer Sciences at University of Massachusetts Amherst

# Sustainable AI



Elevating smaller models



Alternate deployment strategies



Carbon-efficiency and carbon-awareness

## What is sustainable AI?



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<https://thegradiant.pub/sustainable-ai/>

# Sustainable AI

Opinion Paper | [Open Access](#) | [Published: 26 February 2021](#)

## Sustainable AI: AI *for* sustainability and the sustainability *of* AI

[Aimee van Wynsberghe](#) 

[AI and Ethics](#) **1**, 213–218 (2021) | [Cite this article](#)

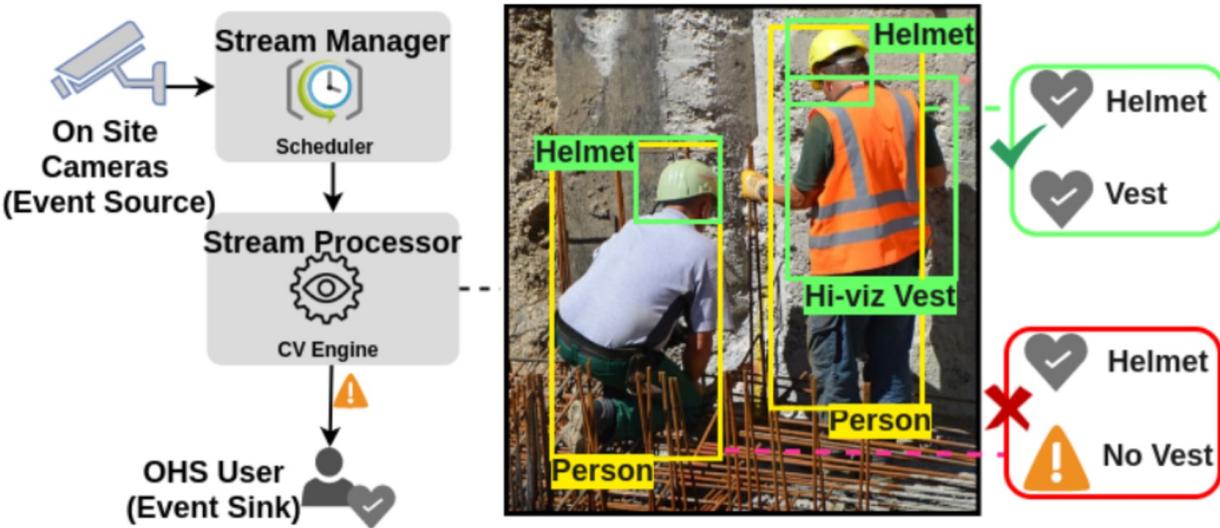
*Sustainable AI is a field of research that applies to the technology of AI (the hardware powering AI, the methods to train AI, and the actual processing of data by AI) and the application of AI while addressing issues of AI sustainability and/or sustainable development.*

*Sustainable AI deals not exclusively with the implementation or use of AI but ought to address the entire life cycle of AI, the sustainability of the: design, training, development, validation, re-tuning, implementation and use of AI.*



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# Reducing Energy usage in Edge AI



Energy-Speed-Accuracy Trade-off Triangle for the Query Quality of Service (F.Pontes et. Al. 2023)

# Conclusion

AI can enable solutions to many societal challenges

Many challenges to deliver on the promise of AI

Responsible AI will require a multidisciplinary approach

## Questions

- Can we trust AI to make decisions?
- What is responsible AI?
- Why is data important for AI?
- Can we overcome the bias in data?
- Can AI improve sustainability?
- Is there an environment cost of AI?