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DATA-POP
ALLIANCE



MIT Connection Science
the technology of innovation

(About) The Promises and Perils of AI for Statistics

Emmanuel Letouzé, PhD

eletouze@datapopalliance.org

18TH WORLD TELECOMMUNICATION/ICT
INDICATORS SYMPOSIUM

ITUWTIS
GENEVA2023

*Advancing the measurement
agenda to achieve universal
and meaningful connectivity*

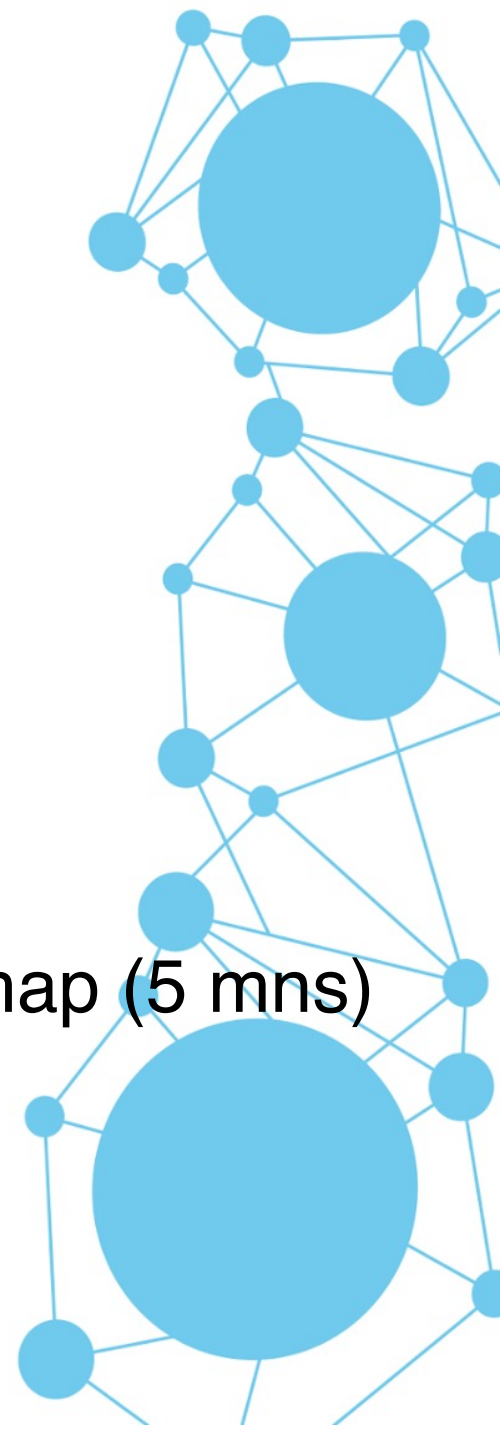
3-4 July 2023
Geneva, Switzerland

#ITUWTIS
www.itu.int/wtis2023



Outline

1. Introduction(s) and Thanks (2mns)
2. Context, Concepts and Question(s) (6 mns)
3. Promise and Opportunities (6 mns)
4. Hurdles and Risks (6 mns)
5. The Way Forward: Requirements and Roadmap (5 mns)



Outline

- 1. Introduction(s) and Thanks**
2. Context, Concepts and Question(s)
3. Promise and Opportunities
4. Hurdles and Risks
5. The Way Forward: Requirements and Roadmap

Many thanks to ITU, the organizing team, Esperanza, Thierry, Fredrik, Alexandre, Anne-Laure, Roseline.....

18TH WORLD TELECOMMUNICATION/ICT
INDICATORS SYMPOSIUM

ITUWTIS GENEVA2023

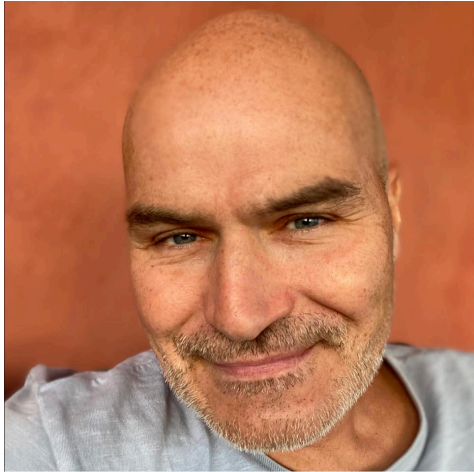
*Advancing the measurement
agenda to achieve universal
and meaningful connectivity*

3-4 July 2023
Geneva, Switzerland

#ITUWTIS
www.itu.int/wtis2023



A bit about my background and trajectory



(Let's connect!)



- **Director and Co-Founder of Data-Pop Alliance (2013—present)**
- Marie Curie Fellow at Universitat Pompeu Fabra (2021—2023)
- Founder and Executive Director of the OPAL project (2016-2020)
- **UN Global Pulse Senior Development Economist (2011-2012)**
- UNDP Economist (2006-2009)
- Technical Assistant for French Ministry of Finance in Vietnam (2000-04)
- (Semi-Failed) Political Cartoonist since 1975
- Post-Doctoral Fellow at MIT Media Lab (2016-17)
- **PhD in Demography from University of California, Berkeley (2009-2016)**
- MA in International Affairs and Development, Columbia U. (2004-2005)
- MA in Economic Demography, Sciences Po Paris (2000)
- BA in Political Science, Sciences Po Paris (1999)
- Technical Advisory Board Member, GPSDD (2016-present)
- **Member of the European Commission Expert Group on “Facilitating the Use of Non-Traditional Data for Official Statistics” (2021-2022)**
- Member of the International Union for the Scientific Study of Population (IUSSP)’s Scientific Panel on Big Data and Population Processes (2016-18)
- Program Committee Member UN World Data Forums I and II (2017-2018)

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HAL VARIAN PREDICTED:
"THE SEXIEST JOB OF THE 21ST
CENTURY will BE STATISTICIAN!"

Note that he didn't specify
when in the 21st century...



MANU
NTTS 2019

Now....will
GAI take
over?

Will AI lead
to a 'Meiji'
moment?

” Big Data / AI and Official Statistics”: The topic is not very new, there’s been some progress, but limited and slow...



60th Anniversary of the National Department of Statistics of Colombia (1



Big Data and Official Statistics: From Opportunities to Strategies

Emmanuel Letouzé*

OECD-Paris21, Paris, France, and University of California, Berkeley, USA

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Eric Bense

OECD-Paris21, Paris, France Eric.BENSEL@oecd.org

Johannes Jütting

OECD-Paris21, Paris, France Johannes.JUTTING@oecd.org

5 Questions on Official Statistics in the Big Data Era

Emmanuel Letouzé

PhD Candidate, UC Berkeley

Fellow, Harvard Humanitarian Initiative

Non-Resident Adviser, International Peace Institute

eletouze@berkeley.edu

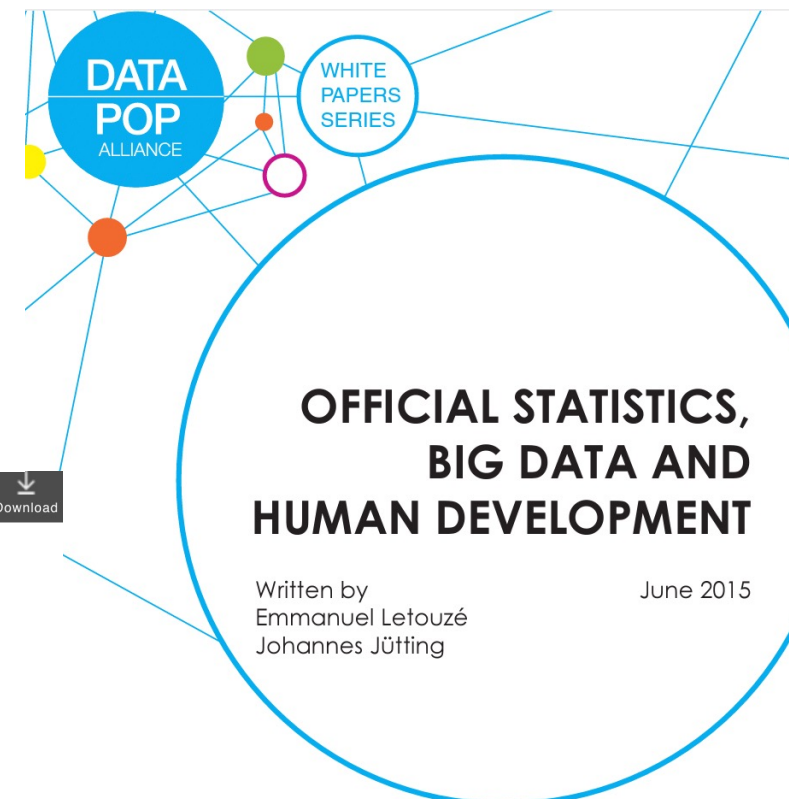
Biblioteca Luis Angel Arango

Bogotá

October 28th, 2013

Outline: 5 questions

1. Why & what is the question? The “Statistical Tragedy” vs. the “Data Revolution”
2. What is ‘Big Data’ about—and not about?
3. What is/are Official Statistics and why does it matter?
4. Where do we stand? Early applications and current limitations
5. Where and how do we move forward and ahead?



Written by
Emmanuel Letouzé
Johannes Jütting

June 2015

DATA-POP ALLIANCE

Inputs to the Big Data and SDGs
Chapter of the 2015
Global Sustainable Development
Report

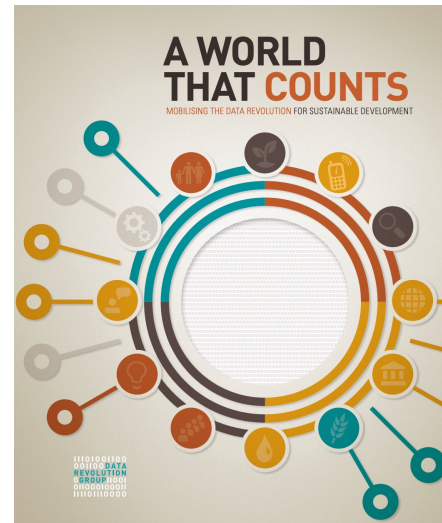
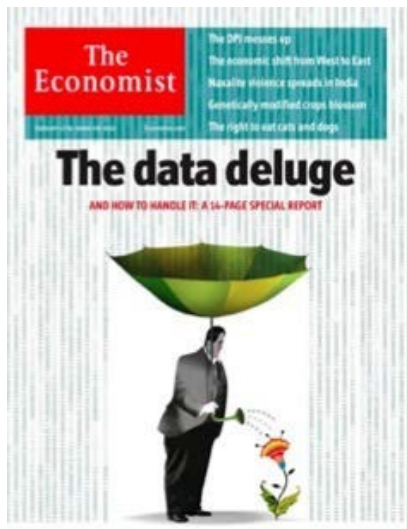
Reflections on Big Data and the Sustainable Development Goals: Measuring & Achieving Development Progress in the Big Data Era

February 2015



IN PARTNERSHIP WITH PARIS21

Let's rewind: the “Data Revolution” raised many expectations



*“We are at the beginning of what I call The **Industrial Revolution of Data.**” Joe Hellerstein, Nov. 2008*

THE DATA REVOLUTION FOR HUMAN DEVELOPMENT

La révolution des données est-elle en marche ?
Implications pour la statistique publique et la démocratie

Thomas Roca, Emmanuel Letouzé

DANS **AFRIQUE CONTEMPORAINE** 2016/2 (n° 258), PAGES 95 À 111

Arab Region NSOs Call For Data Revolution

The world's most
valuable resource is no
longer oil, but data

The
Economist

WIRED

How Valencia crushed Covid with AI

By leveraging algorithms and unorthodox data sources, an MIT researcher has made Valencia a Covid-19 data pioneer

It has fallen short in many respects. Can we course-correct?

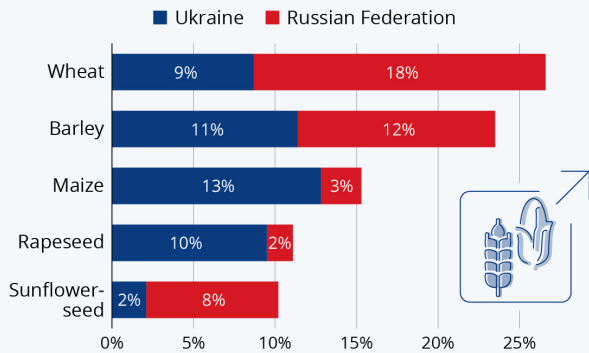
THE WORLD'S RICHEST 1% HAVE MORE THAN TWICE AS MUCH WEALTH AS 6.9 BILLION PEOPLE.

Source: Oxfam 2020

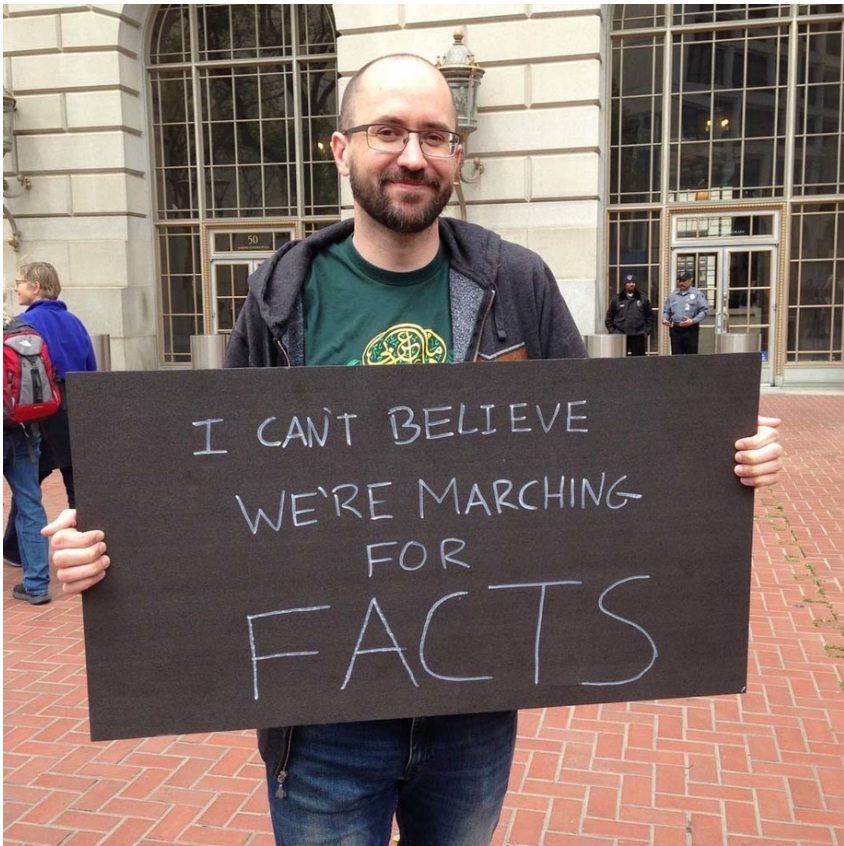
U.S. Billionaire Wealth Surges During Pandemic

Why the War in Ukraine Threatens Global Food Security

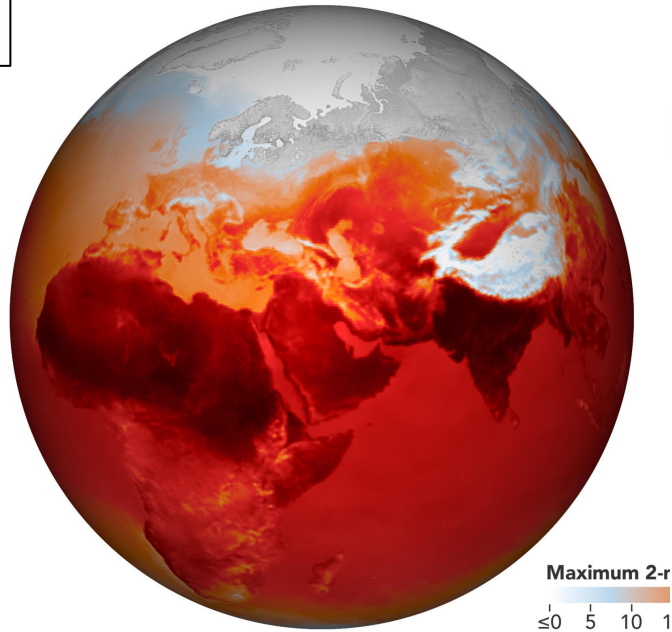
Ukraine's and Russia's share in global exports of selected crops (2016-2020 average)



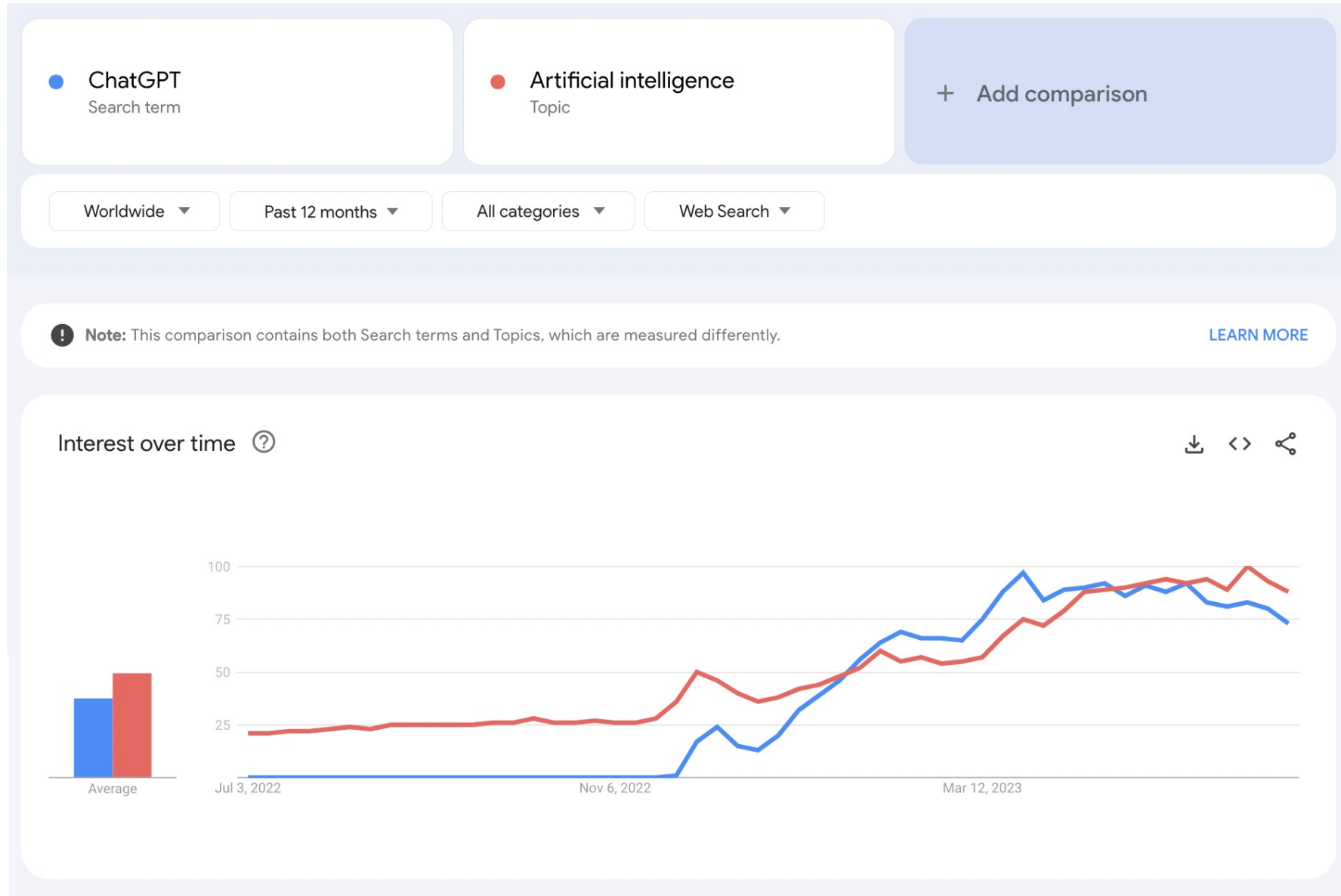
A new low for global democracy



MLTalks: How Data Killed Facts
Jill Lepore in conversation with
Andrew Lippman



‘New’ AI including LLMs (Large Language Models) creates new promises, risks, concerns, and confusion



First, we need clarity and to use concepts and frameworks that account for real world complexities: mine is the 4Cs

| FIGURE 1 |

The four Cs of AI as a socio-technological phenomenon, based on Letouzé (2015).

AI FOR THE SDGS—AND BEYOND? TOWARDS A HUMAN
AI CULTURE FOR DEVELOPMENT AND DEMOCRACY

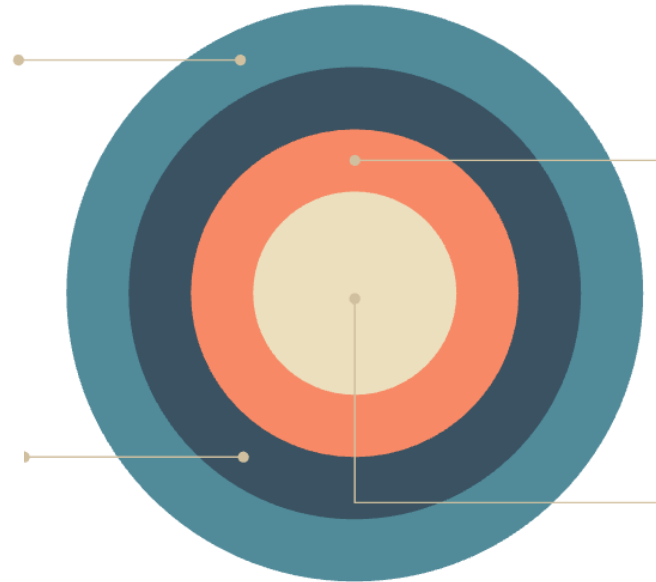
163

AI culture

Incentives, expectations and norms that arise from and shape the use of AI systems. This can be thought of as the superstructure of AI.

AI communities

Contributors, users and developers of AI systems operating and interacting under specific arrangements and regulations (potentially the whole population). This can be thought of as the macrostructure of AI.



AI capacities

The tools and methods, hardware and software, know-how and skills necessary to process and analyze these new kinds of data, as well as to discuss and regulate them. This can be thought of as the infrastructure of AI.

AI crumbs

Pieces of digital data that humans leave behind passively as by-products of actions and interactions involving digital devices and services. This can be thought of as the fuel of AI.

“*Better Data, Better Decisions, Better Lives*” is a (good) slogan BUT the relationship between data, stats, facts, development, democracy, trust and culture is very complex

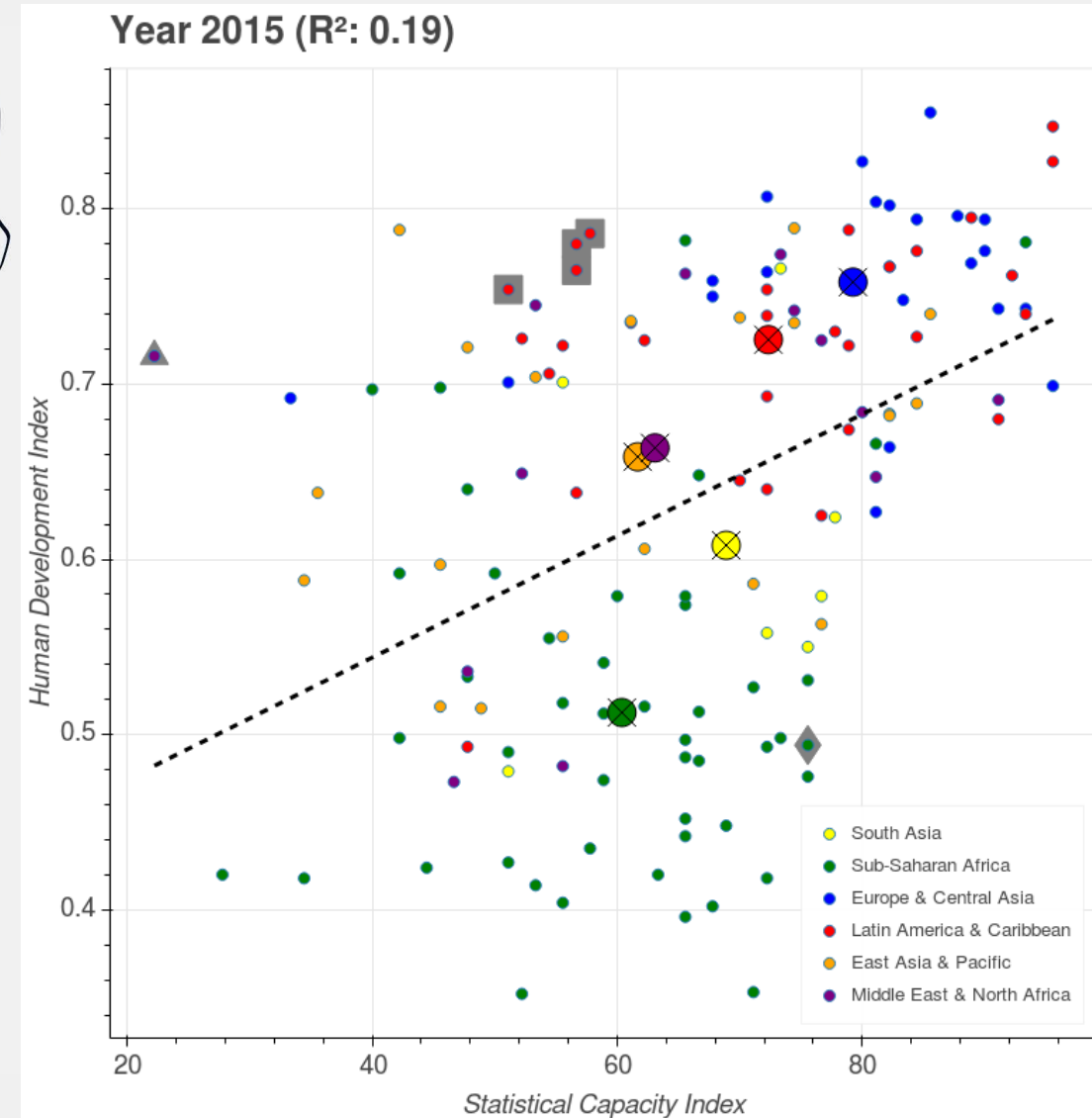
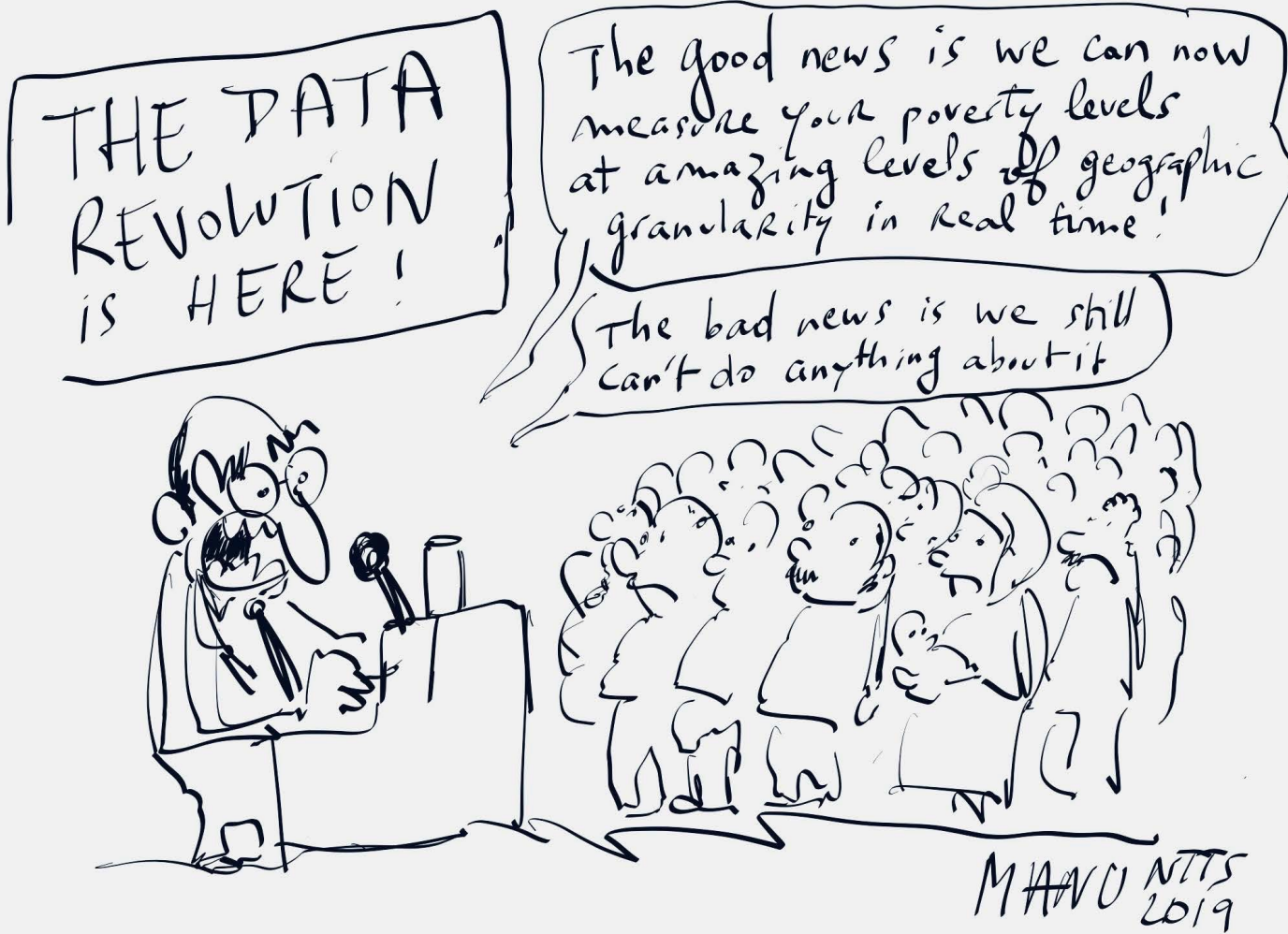
Bruno Latour* (1947-2022)



« What journalists, scientists and other experts fail to grasp, Latour argues, is that ***facts remain robust only when they are supported by a common culture, by institutions that can be trusted, by a more or less decent public life, by more or less reliable media*** ».

* https://en.wikipedia.org/wiki/Bruno_Latour

Statistiks ('Science of the State') is a pretty recent industry and often it seems statistics don't *matter* very much ...



Statistics is actually 2 things, with a dual nature and role

Enrico Giovannini's "Statistics 2.0" on the role of Statistics (2010)

1) As *data* ("official statistics"), to produce knowledge responding to needs and standards

"The essential role of modern statistics, referred to as "statistics 2.0", is to provide society with "knowledge of itself, on which to base its own choices and evaluate the effects of political decisions."

2) As a *public institution* ("Official Statistics"), to provide a deliberative space

".. to freely and openly debate what is worth measuring, how it is measured and why it is measured" – to act as "a debated public institution"

That has implications for our question

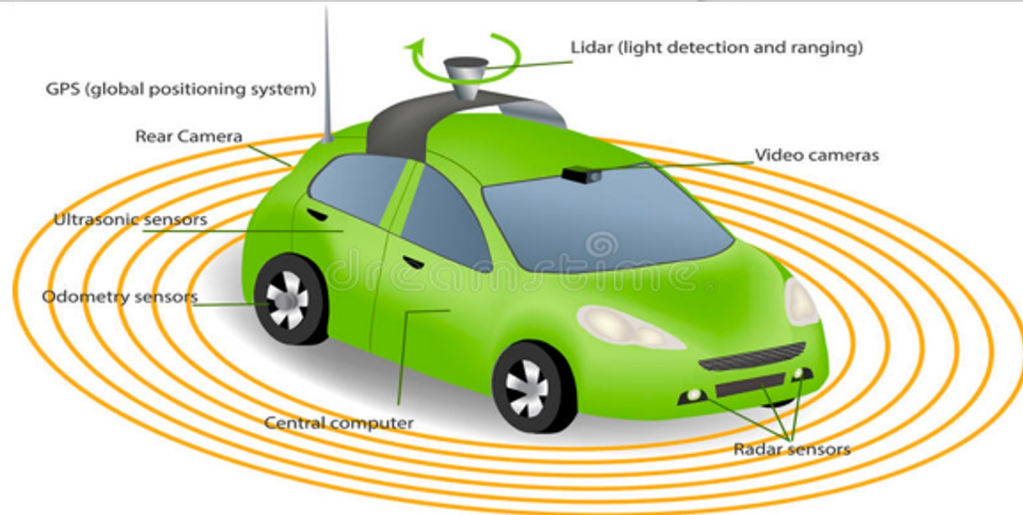
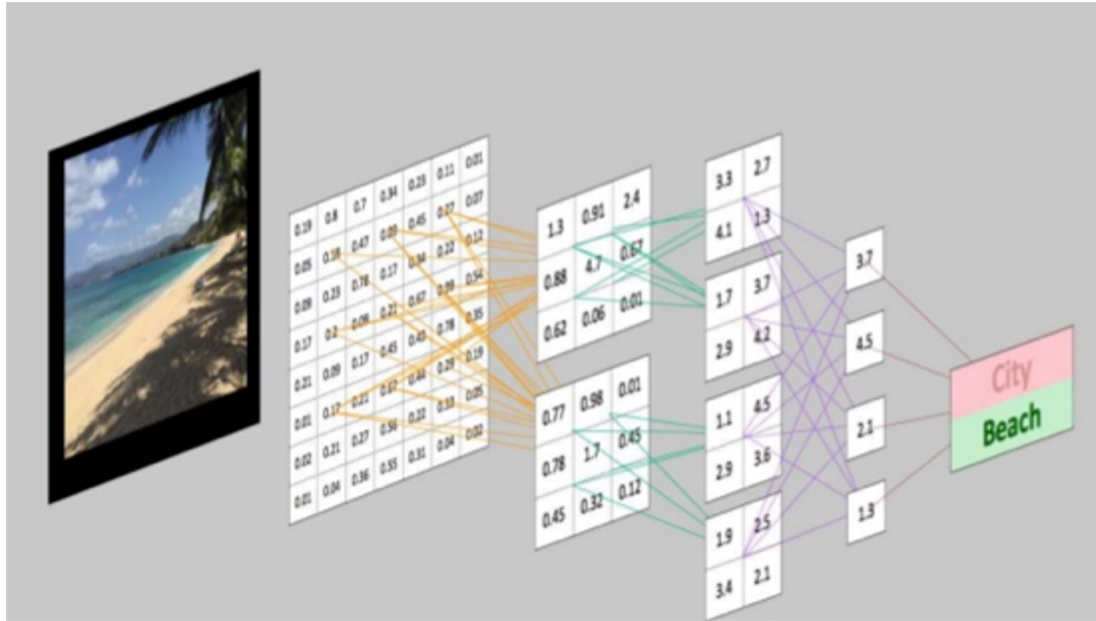
In my view the key question is / remains :

How can Official Statistics *as an industry producing official statistics* leverage AI as conceptualized by the 4Cs to retain, regain, or revive and reinforce its key role for development and democracy?

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Let's go 1 step further: "New" AI is based on machine learning from data (and rewards) through feedback loops



an illustrated introduction to

Predicting socioeconomic levels through cell-phone data

Question:



step ①

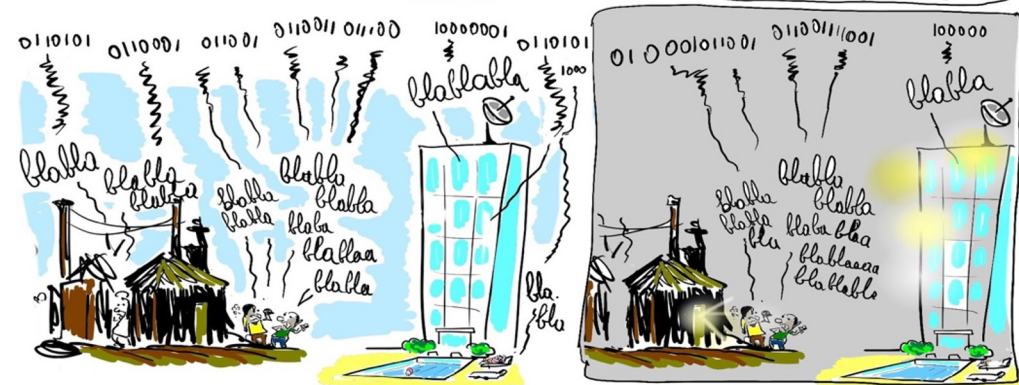
first find or collect actual survey data..



step ②



then notice how cell phone users leave digital traces, day & night ..



This is using AI as an instrument to do X, Y, Z better

(2013)

an illustrated introduction to
Predicting socioeconomic levels through cell-phone data

Question:

so, how is it possible to predict an area's socioeconomic - or poverty- level from the cell-phone data it emits?

step ①

first, find or collect actual survey data..



hello, we are conducting an official survey: are you poor or rich?

step ②



then notice how cell phone users leave digital traces, day & night..

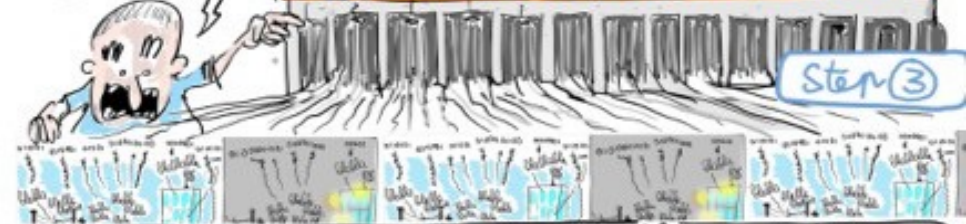


"these 'digital traces', recorded by every telecom operator, are 'Call Detail Records' or CDRs, metadata that look like that"

CALLER ID	CALLER LOCATION	RECIPIENT ID	RECIPIENT LOCATION	CALL TIME	CALL DURATION
X36372	2°24'12"	A9C48L	3°32'43"	204/04/10	01:12:17
3745Y	35°49'52"	Tc73646	31°12'12"	ET 17 12	

TELECOM OPERATOR DATA CENTER

step ③



"and these CDRs will show differences in calling patterns between different areas..."

step ④

poor area

rich area

their 'digital signatures' will differ



maybe people in richer areas will stop calling sooner at night?

step ⑤

and using computers and algorithms, researchers try to find the strongest correlations

between CDRs and survey data to build a predictive model..



step ⑥

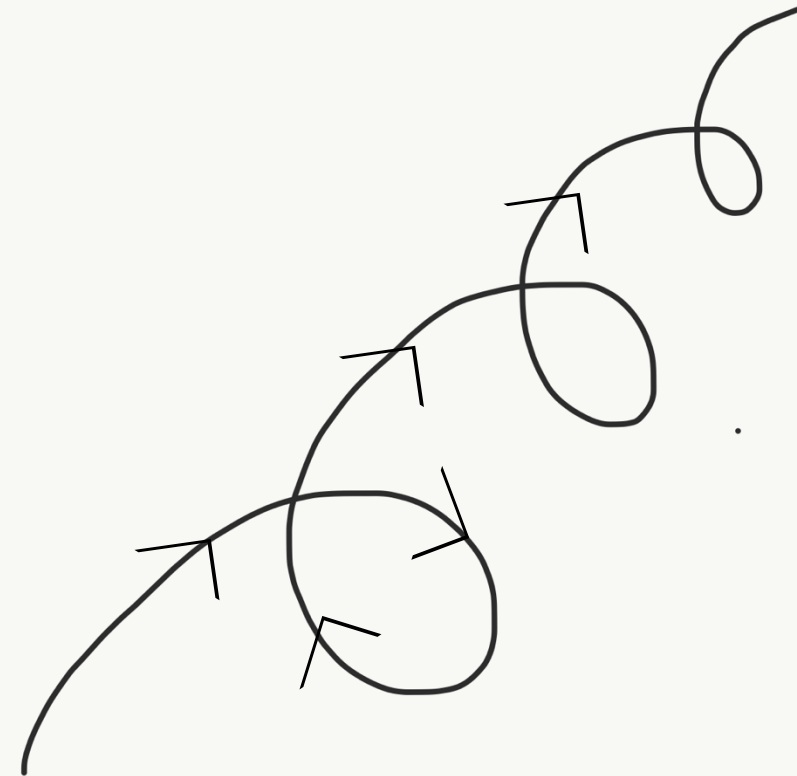
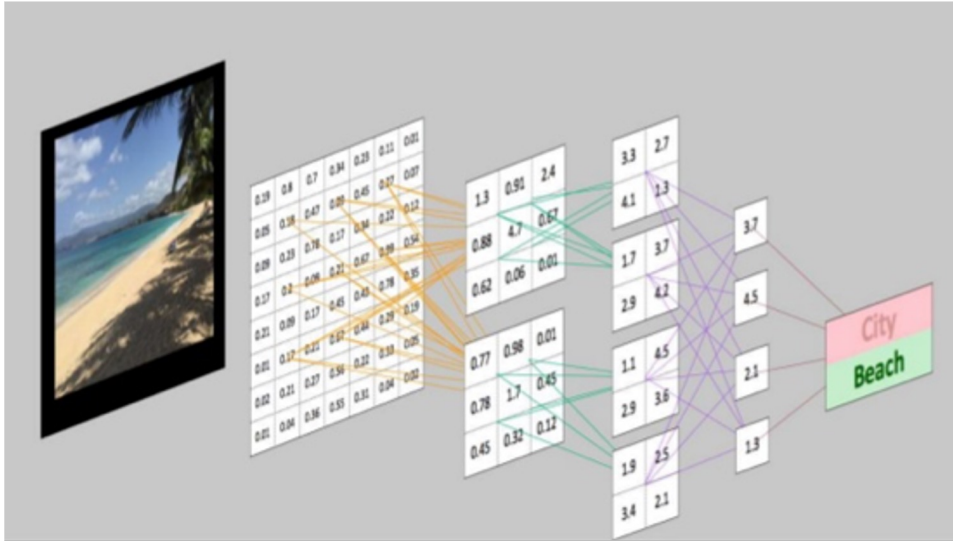
that can then take CDRs from a later time or different area

and turn them into estimates of socioeconomic levels without a survey!



MANU.

Another opportunity (an obligation) is a deeper cultural shift towards a “*Human AI*” where AI is used as an *inspiration*



Machine learning and human learning facilitated by data-infused feedback loops

Human AI is a vision where AI is used as an instrument ('Humane AI') + as an inspiration for learning societies



ITU Journal: *ICT Discoveries*, Special Issue No. 2, 6 Dec. 2018

TOWARDS A HUMAN ARTIFICIAL INTELLIGENCE FOR HUMAN DEVELOPMENT

Emmanuel Letouzé¹, Alex Pentland²

¹Data-Pop Alliance, MIT Media Lab, and OPAL, ²MIT and Data-Pop Alliance, and OPAL

Abstract – This paper discusses the possibility of applying the key principles and tools of current artificial intelligence (AI) to design future human systems in ways that could make them more efficient, fair, responsive, and inclusive.



3. Retrouver le sens de la mesure pour de meilleures décisions collectives : vers une intelligence artificielle humaine à l'ère des données

Emmanuel Letouzé

DANS **REGARDS CROISÉS SUR L'ÉCONOMIE** 2018/2 (n° 23), PAGES 47 À 55

- CITER OU EXPORTER
- AJOUTER À UNE LISTE
- SUIVRE CETTE REVUE

ARTICLE

RÉSUMÉ

PLAN

AUTEUR

SUR UN SUJET PROCHE

ACHETER

Français Les données personnelles et institutionnelles récoltées de plus en plus massivement à l'échelle mondiale ouvrent la voie à de nouvelles façons de penser la prise de décision collective. Cet article présente les conditions d'un traitement de ces données tourné vers le développement humain, au travers du concept d'Intelligence Artificielle Humaine (IAH). Nous présentons à cet égard un exemple de projet destiné à appliquer ce concept dans plusieurs pays en développement.



AI FOR THE SDGS—AND BEYOND? TOWARDS A HUMAN AI CULTURE FOR DEVELOPMENT AND DEMOCRACY

EMMANUEL LETOUZÉ

Marie-Curie Fellow at Universitat Pompeu Fabra and Director and Co-Founder of the Data-Pop Alliance

NURIA OLIVER

Scientific Director and Co-Founder of the ELLIS Unit Alicante Foundation and Chief Data Scientist at the Data-Pop Alliance

BRUNO LEPRI

Senior Researcher at Fondazione Bruno Kessler and Senior Research Affiliate at the Data-Pop Alliance

PATRICK VINCK

Assistant Professor at the Harvard Medical School and Harvard T.H. Chan School of Public Health, Co-Founder and Co-Director of the Data-Pop Alliance

- | | |
|--|--|
| SDG1 - No Poverty | SDG10 - Reduced Inequalities |
| SDG2 - Zero Hunger | SDG11 - Sustainable Cities and Communities |
| SDG3 - Good Health and Wellbeing | SDG12 - Responsible Consumption and Production |
| SDG5 - Gender Equality | SDG16 - Peace, Justice and Strong Institutions |
| SDG8 - Decent Work and Economic Growth | SDG17 - Partnerships for the Goals |
| SDG9 - Industry, Innovation and Infrastructure | |

Central to *Human AI* is the willingness and ability to learn and change from feedback provided by others and stats



U.S. Billionaire Wealth Surges During Pandemic

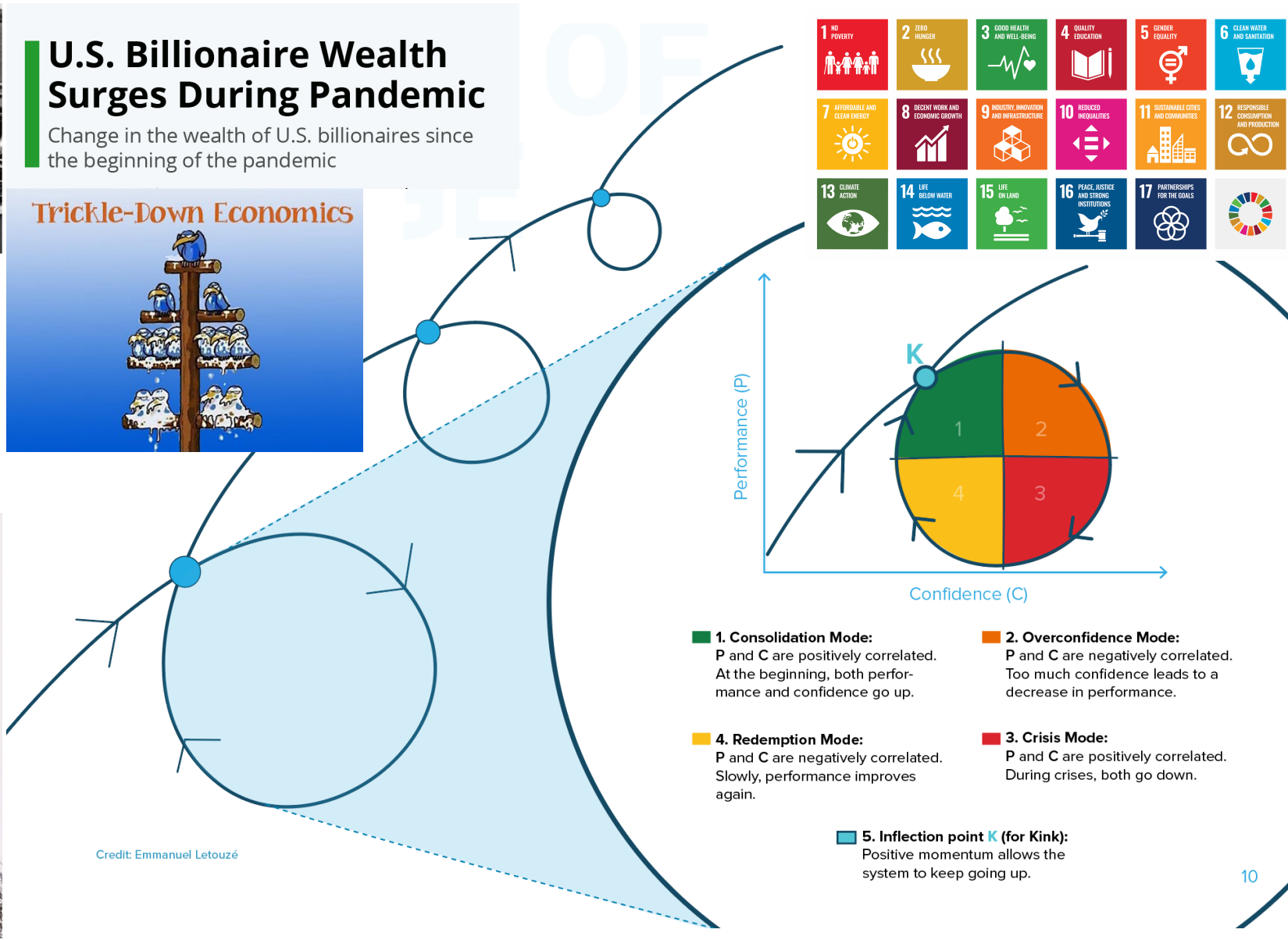
Change in the wealth of U.S. billionaires since the beginning of the pandemic



"PRISONS MAKE US SAFER"

AND 20 OTHER MYTHS ABOUT MASS INCARCERATION

VICTORIA LAW



So, what are the key ways in which Official Statistics can use AI to achieve its role for development and democracy?

1. Improve measurement of phenomenon that matter to societies

Better picture of human reality societies want to have; more timely, more granular, more disaggregated, more *relevant* too....== new indicators! Beyond GDP, social cohesion, happiness, corruption,

2. Improve and influence knowledge and trust among the the public

Better communicate, facilitate access (ChatGPT and other Chatbots)

Fight dis/misinformation to protect societies

3. Improve operations

More efficient / smarter official statistics; better allocation of resources during surveys for example; analyze systems performance

4. Upgrade culture, mindset and incentives for change among systems and staff

Change mindset towards innovation and impact not statistical production

Develop innovative projects and partnerships to retain high-skilled staff

Early works focused on CDRs have showed the promise



Scientific Prize and Ethics Mention: Construction of socio-demographic indicators with digital breadcrumbs

F. Bruckschen ⁽¹⁾, T. Schmid ⁽²⁾, T. Zbiranski ⁽¹⁾

We show that socio-demographic indicators such as population, age, literacy, poverty, religion, ethnicity, electricity supply and others can be estimated in unprecedented detail and virtually ad-hoc using antenna-to-antenna traffic data only. We offer a uniform approach that can be easily extended to other variables. Results are tested for spatio-temporal robustness and visualized as heat maps.

(1) Humboldt Universität Berlin, Germany - (2) Freie Universität Berlin, Germany

(2013)

ECONOMICS

Predicting poverty and wealth from mobile phone metadata

(2014)

Joshua Blumenstock,^{1*} Gabriel Cadamuro,² Robert On³

Accurate and timely estimates of population characteristics are a critical input to social and economic research and policy. In industrialized economies, novel sources of data are enabling new approaches to demographic profiling, but in developing countries, fewer sources of big data exist. We show that an individual's past history of mobile phone use can be used to infer his or her socioeconomic status. Furthermore, we demonstrate that the predicted attributes of millions of individuals can, in turn, accurately reconstruct the distribution of wealth of an entire nation or to infer the asset distribution of microregions composed of just a few households. In resource-constrained environments where censuses and household surveys are rare, this approach creates an option for gathering localized and timely information at a fraction of the cost of traditional methods.

FLOWMINDER.ORG world pop

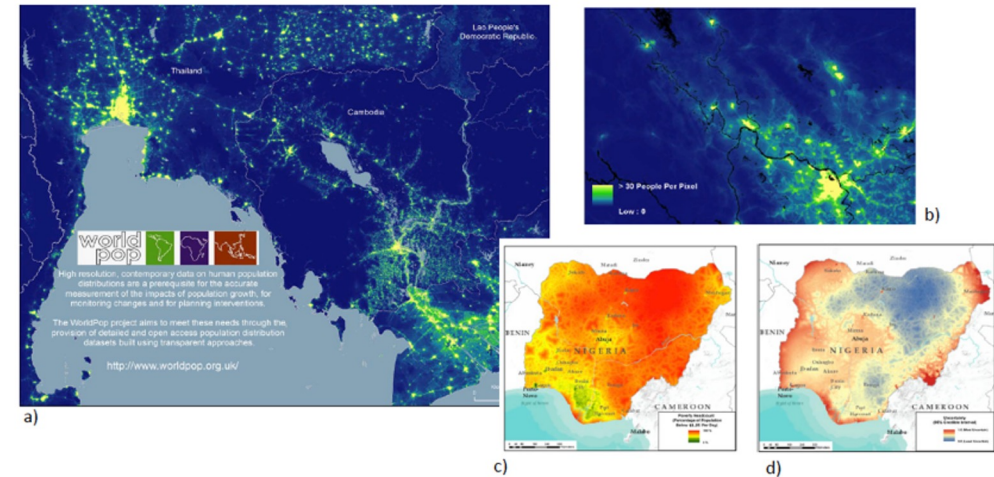
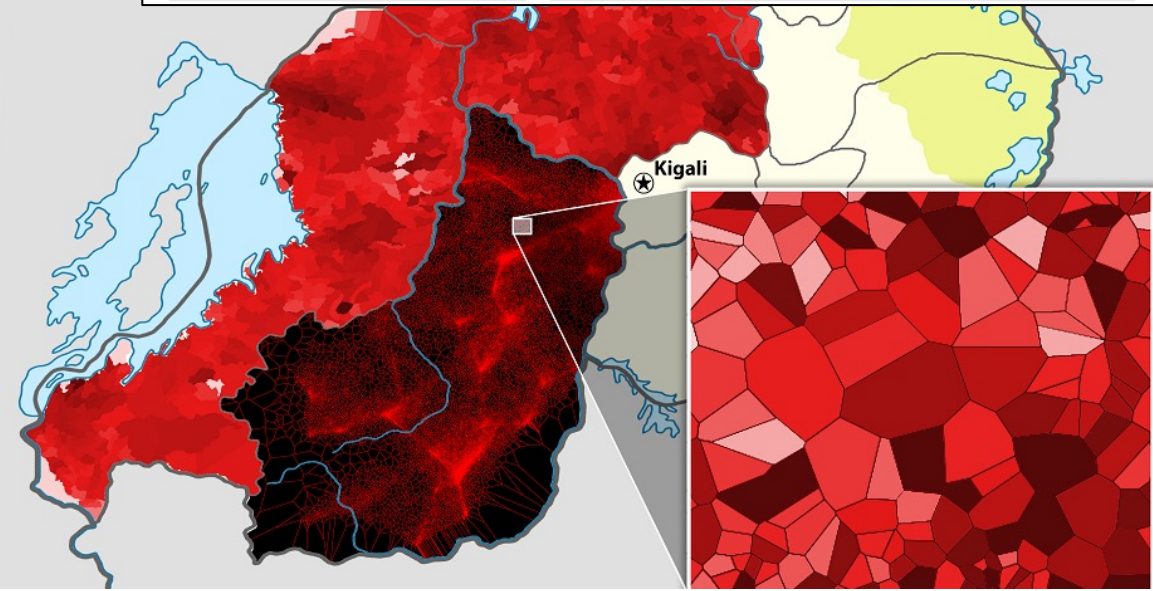


Figure 1: a) WorldPop population density distributions for the the Mekong region; b) close-up picture of population distributions (100x100m) for the Hanoi region; c) Poverty headcounts for Nigeria (<1.25 USD/day) per 1 km²; d) Uncertainty in poverty headcount estimates per 1 km² area.



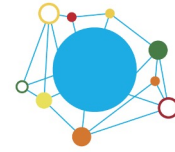
EO data have also showed promise and are underused

Pilots in Brazil



Two Favelas:

- Favela dos Sonhos (Ferraz de Vasconcelos, São Paulo)
- Morro da Providência (Rio de Janeiro, [Rio de Janeiro](#))



DATA-POP
ALLIANCE

Changing the world with data


GERANDO FALCÕES

MIT
MANAGEMENT
LATIN AMERICA OFFICE



Ferraz de Vasconcelos

Rio de Janeiro



10 REDUCED
INEQUALITIES



11 SUSTAINABLE CITIES
AND COMMUNITIES

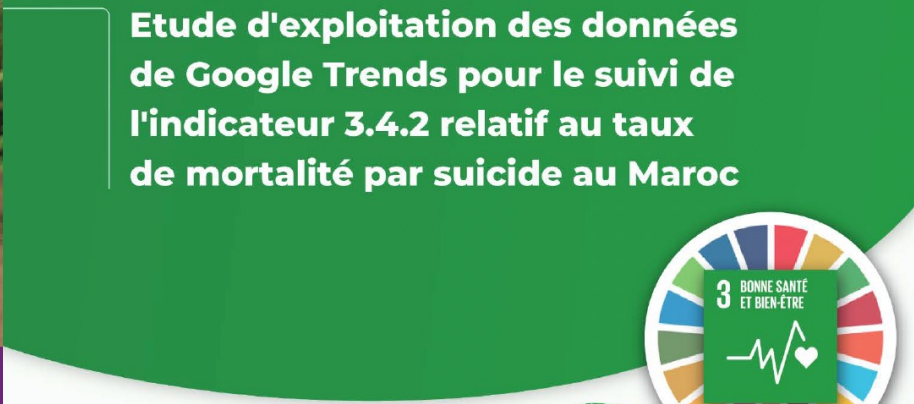


New / sensitive questions should be (re)explored with AI

The Under-Representation of Women in a Disney Book from 1983

Using old data to understand how gender and racial norms have changed

 Robert McKeon Aloe Nov 10, 2020 · 4 min read



But we are stuck in an *MVP-PoC-Pilots-Promise* trap. Why?

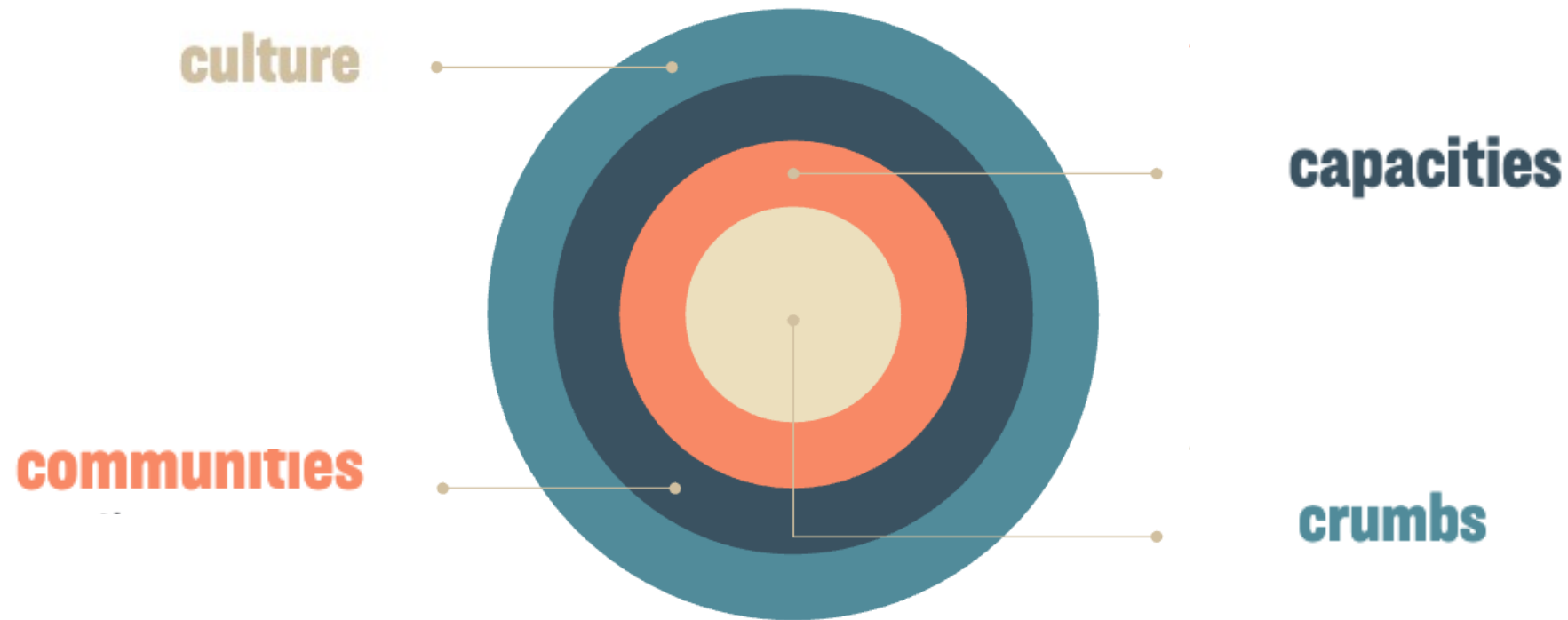


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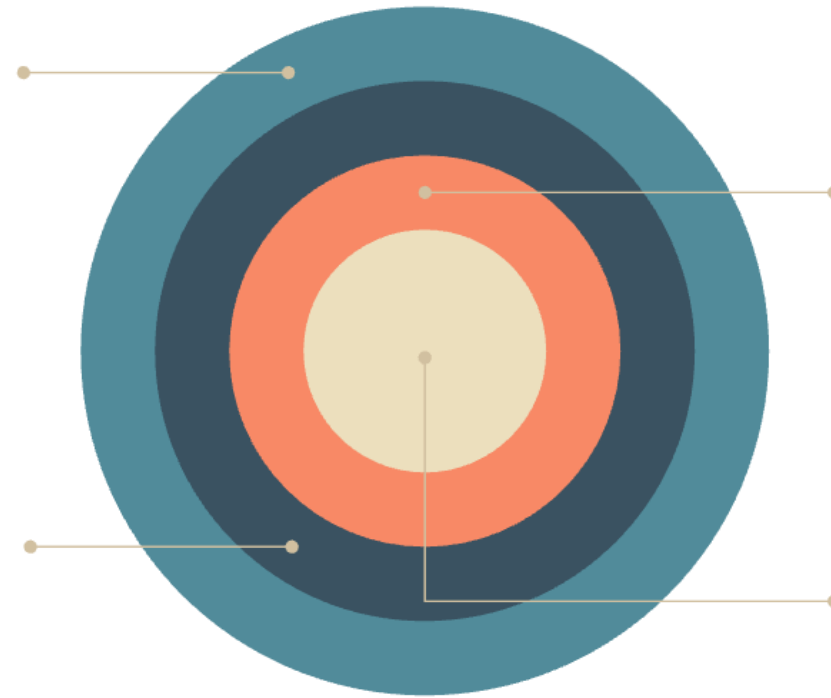
Hurdles and risks according to the 4 Cs framework

(N.B: classes of hurdles and risks for leveraging AI as an instrument and an inspiration)



Hurdles and risks according to the 4 Cs framework

(N.B: classes of hurdles and risks for leveraging AI as an instrument and an inspiration)



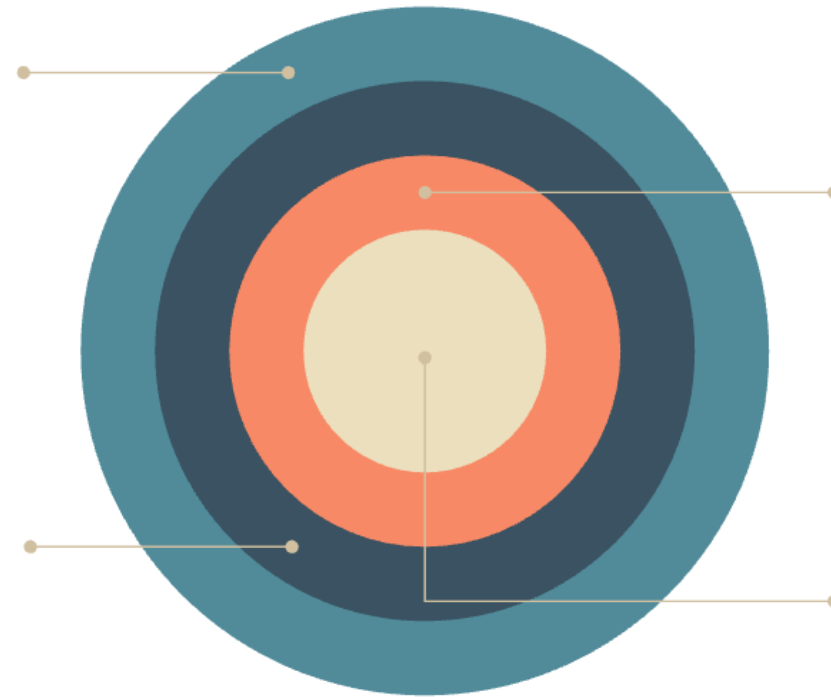
crumbs

Include:

Locked, messy, non-interoperable, hard to access;
plus dis-misinformation and deep fakes....

Hurdles and risks according to the 4 Cs framework

(N.B: classes of hurdles and risks for leveraging AI as an instrument and an inspiration)



capacities

Include:

Major capacity and financial gaps and disparities; talent attraction and retention; infrastructure limitations...

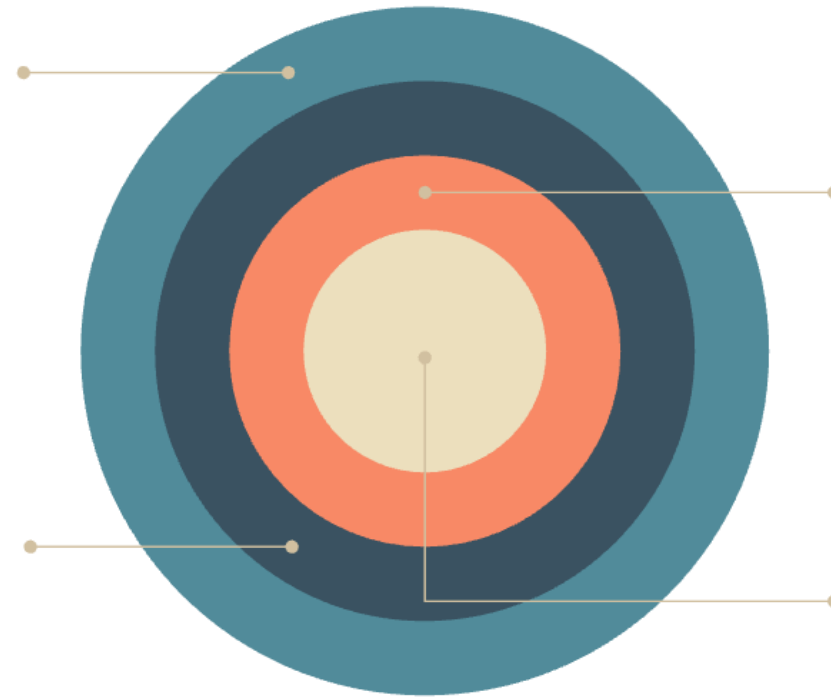
Hurdles and risks according to the 4 Cs framework

(N.B: classes of hurdles and risks for leveraging AI as an instrument and an inspiration)

communities

Include:

Poor connections with industry and academia; Limited trust and interactions with users; Bad actors; Inadequate regulatory frameworks, no sustainable business models....



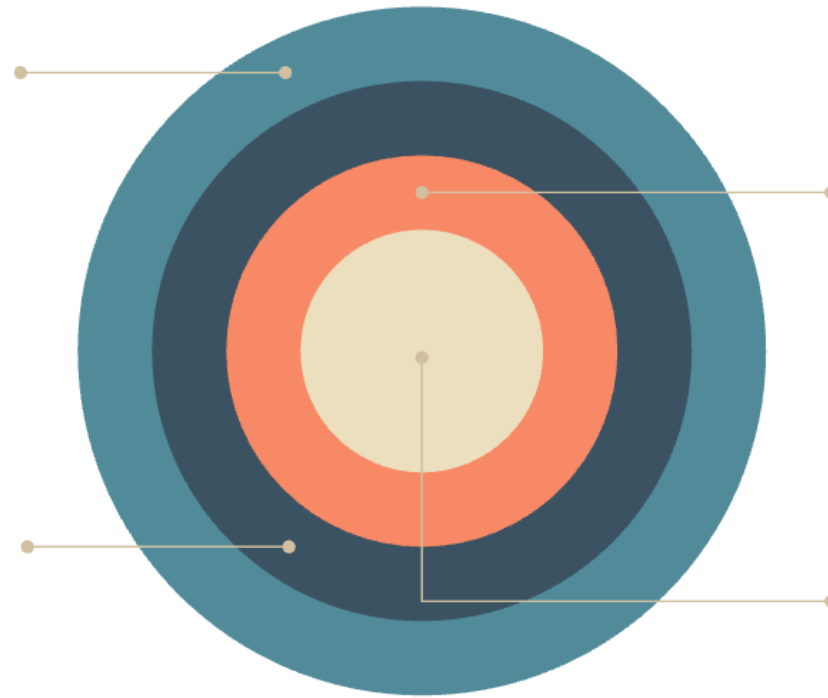
Hurdles and risks according to the 4 Cs framework

(N.B: classes of hurdles and risks for leveraging AI as an instrument and an inspiration)

culture

Include:

Focus on “statistical production” mindset, little to no incentive, time and funding think and do things differently at scale; culture of distrust for expertise...



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Recall: key to *Human AI* is the willingness and ability to learn and change from feedback provided by statistics



U.S. Billionaire Wealth Surges During Pandemic

Change in the wealth of U.S. billionaires since the beginning of the pandemic

Trickle-Down Economics



is
appens
n loop
rowth.



"PRISONS MAKE US SAFER"

AND 20 OTHER MYTHS ABOUT MASS INCARCERATION

VICTORIA LAW

TARGET

16-5

SUBSTANTIALLY REDUCE CORRUPTION AND BRIBERY

1 NO POVERTY

2 ZERO HUNGER

3 GOOD HEALTH AND WELL-BEING

4 QUALITY EDUCATION

5 GENDER EQUALITY

6 CLEAN WATER AND SANITATION

7 AFFORDABLE AND CLEAN ENERGY

8 DECENT WORK AND ECONOMIC GROWTH

9 INDUSTRY, INNOVATION AND INFRASTRUCTURE

10 REDUCED INEQUALITIES

11 SUSTAINABLE CITIES AND COMMUNITIES

12 RESPONSIBLE CONSUMPTION AND PRODUCTION

13 CLIMATE ACTION

14 LIFE BELOW WATER

15 LIFE ON LAND

16 PEACE, JUSTICE AND STRONG INSTITUTIONS

17 PARTNERSHIPS FOR THE GOALS

18 LIFE ON LAND

19 FUTURE OF HUMANITY

20 INDIGENOUS PEOPLES

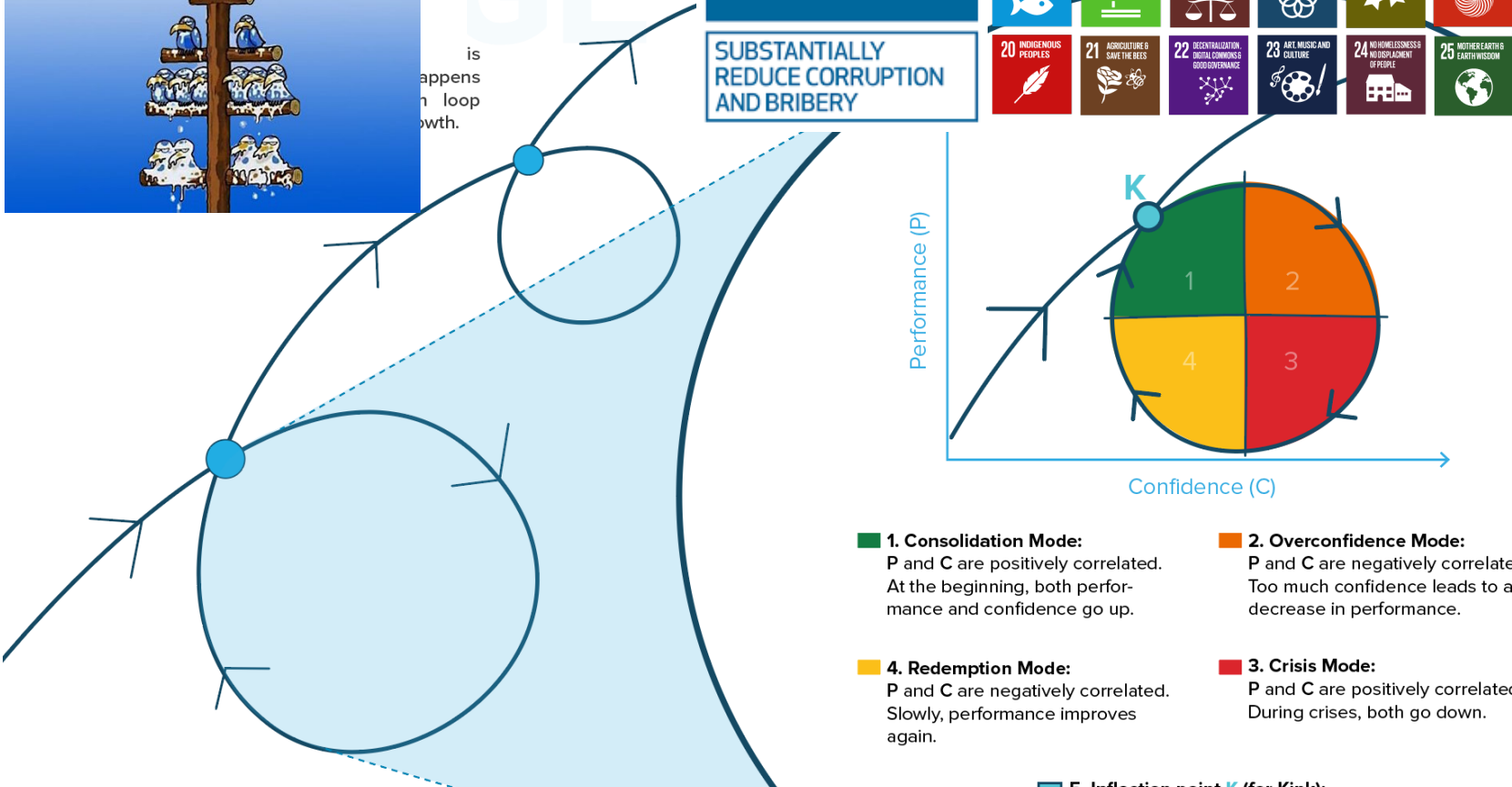
21 SUSTAINABLE DEVELOPMENT GOALS

22 DIGITAL TRANSFORMATION AND GOVERNANCE

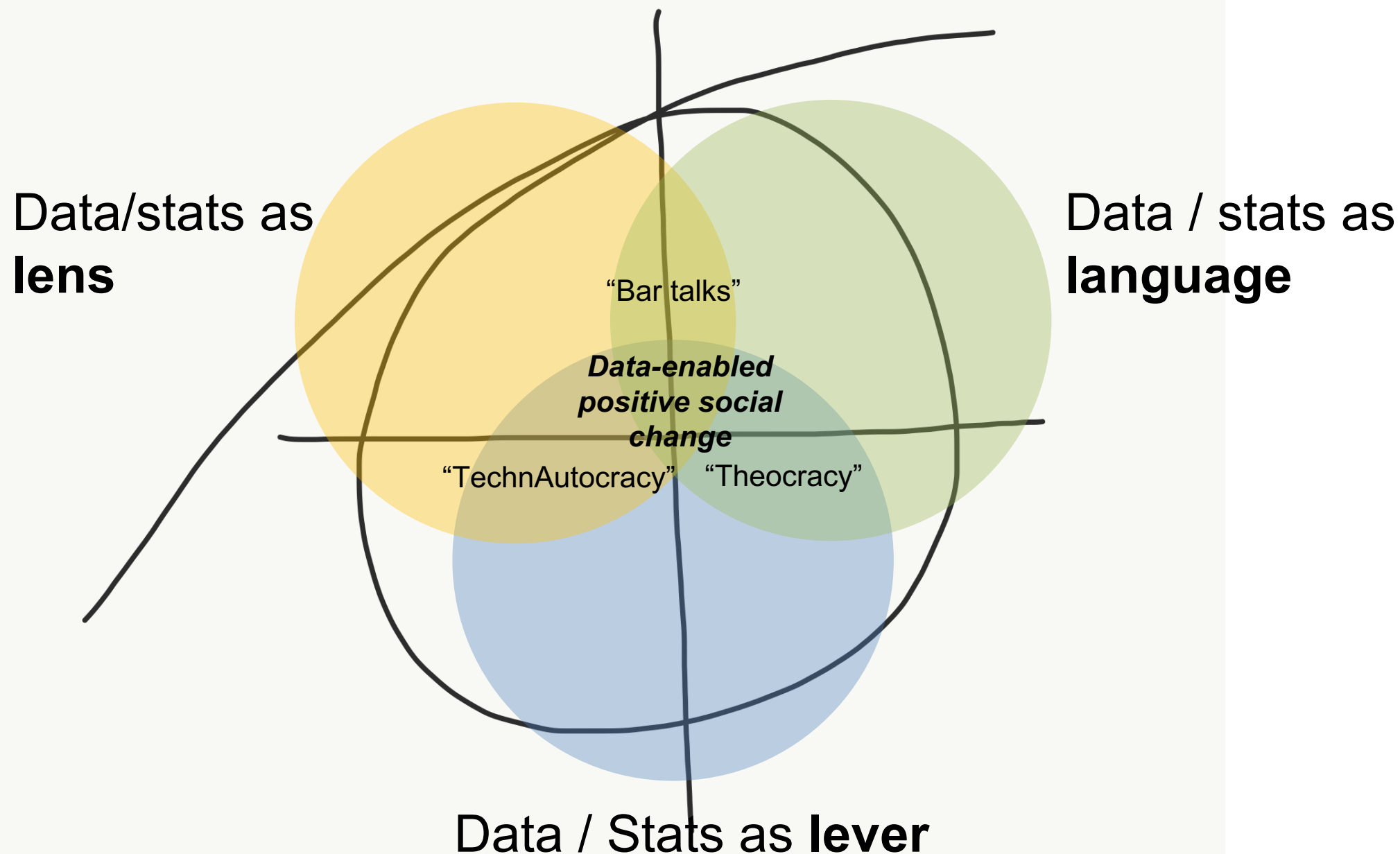
23 CULTURE AND CREATIVITY

24 NO HOMELESSNESS AND DISPLACEMENT OF PEOPLE

25 MOTHER EARTH AND EARTH SYSTEMS



3 functions of data and statistics enable this process



For this we need *socio-political innovations* for capacities, communities and culture to use AI towards humanistic values

DATA-POP ALLIANCE
WHITE PAPER SERIES

Beyond Data Literacy:
Reinventing Community
Engagement and Empowerment
in the Age of Data

October 2015

Empowering society by
reusing privately held data
for official statistics —
A European approach

FINAL REPORT PREPARED BY THE
HIGH-LEVEL EXPERT GROUP ON FACILITATING THE
USE OF NEW DATA SOURCES FOR OFFICIAL STATISTICS

2022 edition

BY STUART E. MIDDLETON, EMMANUEL LETOUZÉ,
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Trust, Regulation, and Human- in-the-Loop AI within the European Region

Article | Published: 24 October 2018

The Moral Machine experiment

Edmond Awad, Sohan Dsouza, Richard Kim, Jonathan Schulz, Joseph Henrich, Azim Shariff, Jean-François Bonnefon & Iyad Rahwan

Nature 563, 59–64 (2018) | [Cite this article](#)



Global
Partnership
for Sustainable
Development Data

Home About Countries Partners Resources Initiatives SDGs News Data Values



The Data
Values Project

Data Values Project Blog



Data as a route to inclusion and equity

The CODE for building
participatory and ethical data
projects



OpenAI

Research Product Developers Safety

Democratic inputs to AI

Our nonprofit organization, OpenAI, Inc., is launching a program to award ten \$100,000 grants to fund experiments in setting up a democratic process for deciding what rules AI systems should follow, within the bounds defined by the law.

MISINFORMATION AND DISINFORMATION

An international
effort using
behavioural
science to
tackle the
spread of
misinformation

Public Governance Policy Paper



OECD

OPSI



MINISTÈRE
DE LA TRANSFORMATION
ET DE LA FONCTION
PUBLIQUES

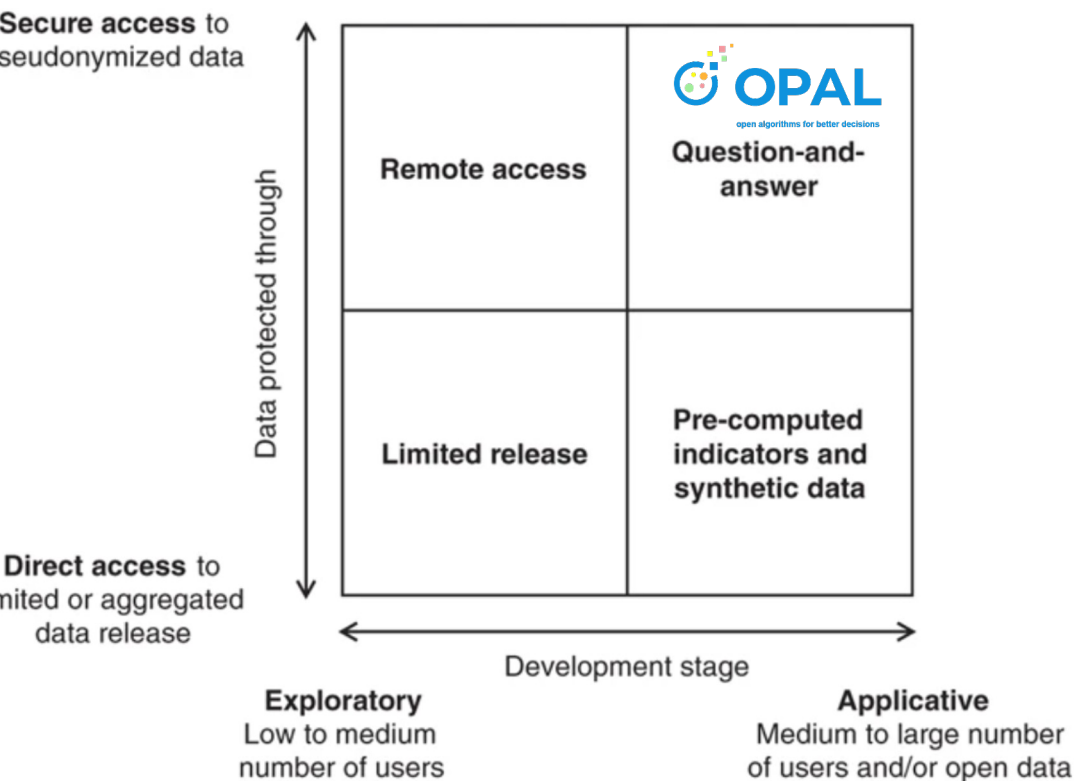
Direction
interministérielle
de la transformation
publique

We need to allow analysis of sensitive ‘Crumbs’ (both private, and public) in privacy-preserving and *participatory* ways at scale

Open algorithms: A new paradigm for using private data for social good

By Thomas Roca, Emmanuel Letouzé

18 July 2016



de Montjoye, Y., Gambs, S., Blondel, V. *et al.* On the privacy-conscious use of mobile phone data. *Sci Data* 5, 180286 (2018). <https://doi.org/10.1038/sdata.2018.286>

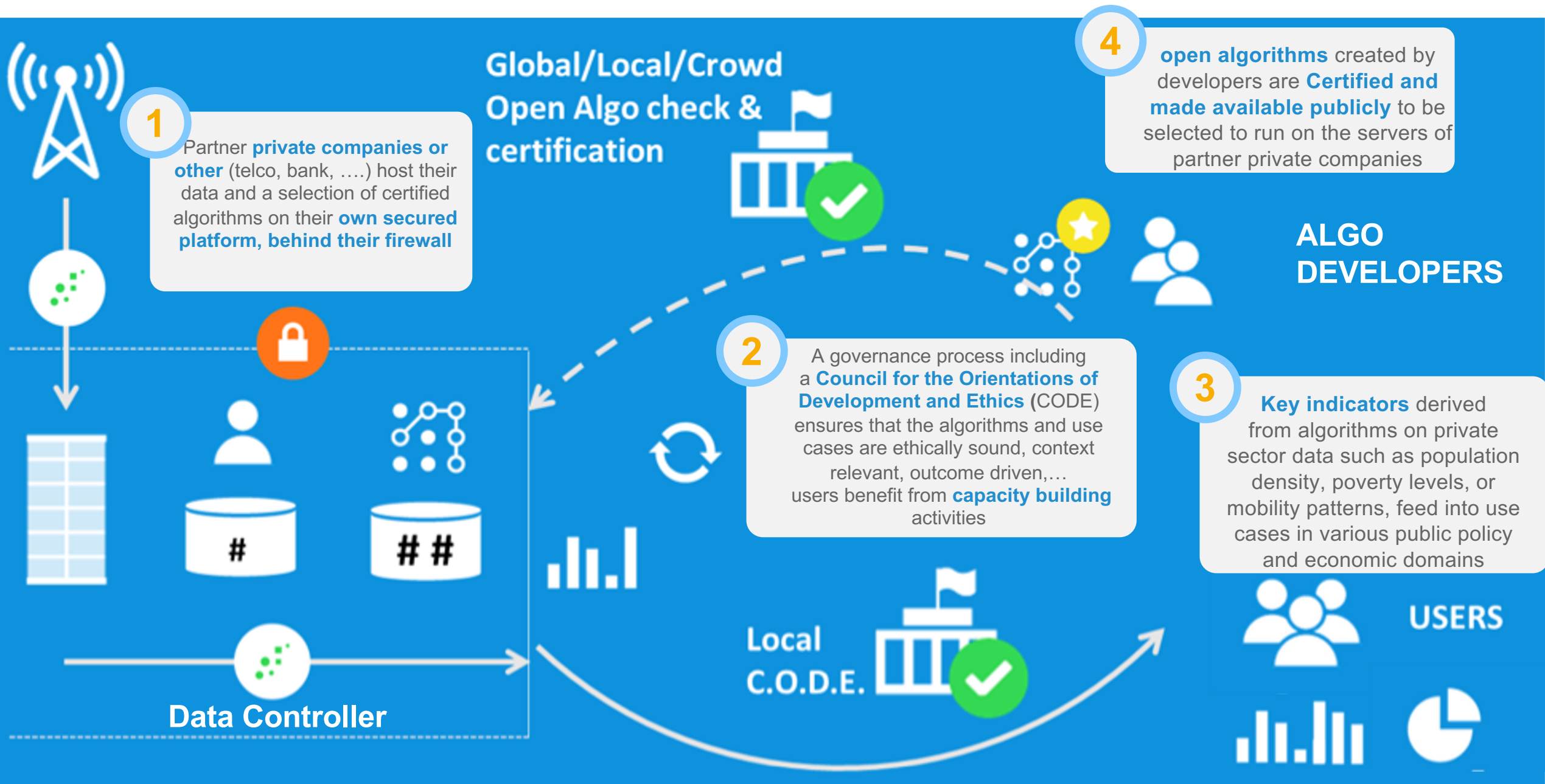
Science & technology | Data privacy

The UN is testing technology that processes data confidentially

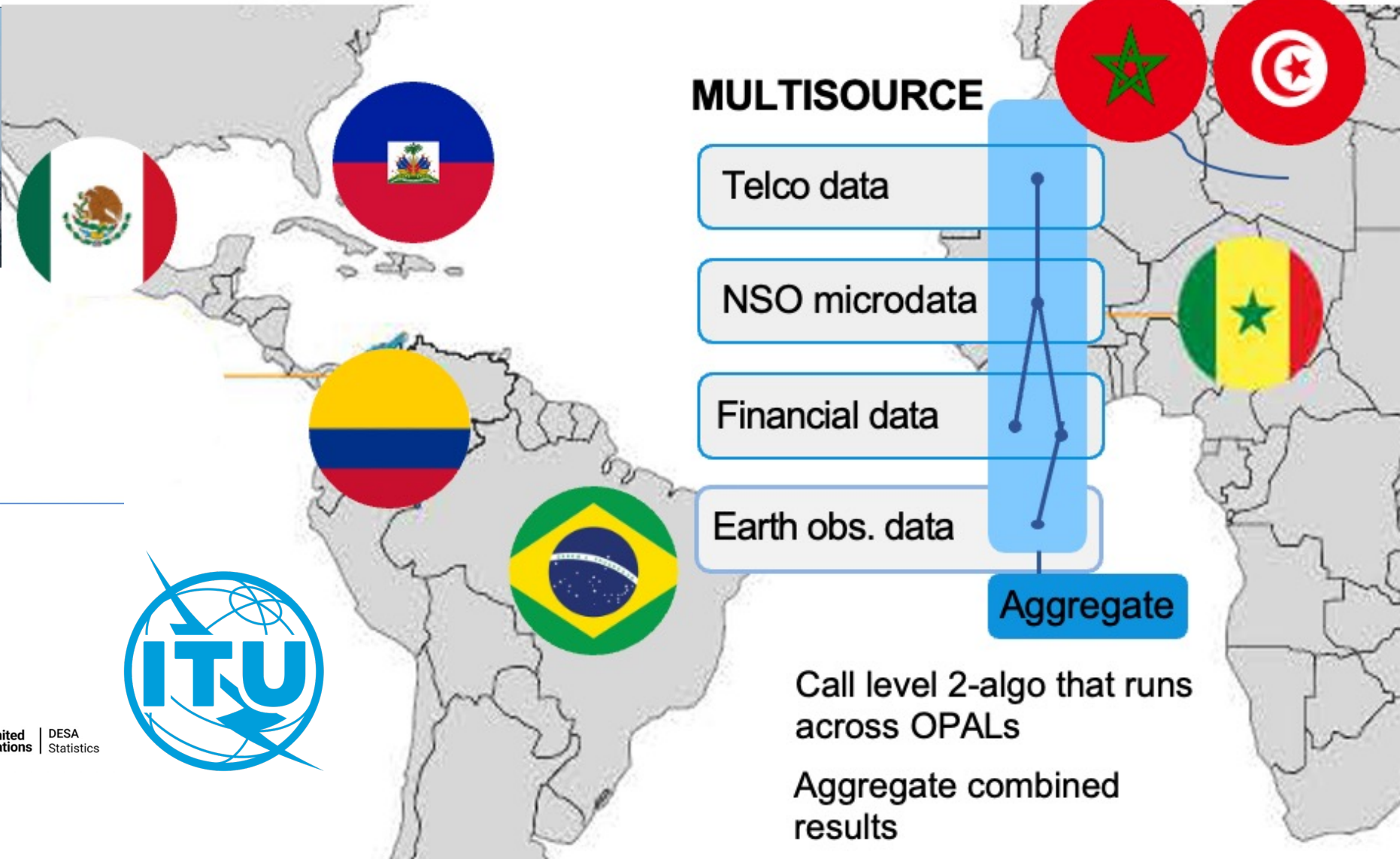
How to analyse data without revealing their secrets



The Open Algorithms (OPAL) vision is 1 kind of *poly-innovation*



On DPA's roadmap: Multisource “OPAL for the SDGs” in Senegal, Morocco, Tunisia, Brazil, Mexico, Colombia, Haiti...



Other efforts too..

Data For Now > Data For Now in Colombia and Senegal



Conclusions

1. **The promises of the Data Revolution have not been met**; the world is not significantly better; Big Data and AI pilots, MVPs etc., have not scaled...this could go on with AI and backlash seriously
2. **That must change; AI offers a historical opportunity and a political-moral obligation for Official Statistics** as an industry to retain, regain and actually revive and reinforce its role as an enabler of societal progress through feedback loops
3. **If not, there are real political risks bad actors, bad statistics and dis-misinformation** will pollute societal debates and further fuel chaos
4. **In an “Human AI” vision, AI should serve as an instrument to improve statistical products and services, and as an inspiration for statistical systems and societies at large**, in which stats are key
5. **Achieving that vision requires massive investments, innovations and collaborations**—orders of magnitude more ambitious than what we are seeing and is projected. **Let’s make it happen?**





Universitat
Pompeu Fabra
Barcelona



HARVARD
HUMANITARIAN
INITIATIVE



DATA-POP
ALLIANCE



MIT Connection Science
the technology of innovation

Thank you

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