

What has changed in official statistics since using Big
Data and data science for the last 10 years?



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Assistant Director
United Nations Statistics Division



# UN Committee of Experts on Big Data and Data Science for official statistics

Mandate (Decision 45/110 – 2014)

- Provide strategic vision of a global programme on Big Data for official statistics;
- Promote practical use of sources of Big Data and find solutions for
  - Methodological issues,
  - Legal issues of access to data sources;
  - Privacy issues
  - Data security issues;
  - Cost benefit analysis
- Promote capacity building
- Foster Communication and Advocacy
- Build Public Trust

# UN Committee of Experts on Big Data and Data Science for official statistics



REGIONAL HUB LAC, BRAZIL

REGIONAL HUB A&P INDONESIA/UNESCAP

REGIONAL HUB AFRICA RWANDA/UNECA

REGIONAL HUB MENA, DUBAI, UAE

GLOBAL HUB ON ARIES FOR SEEA, BILBAO

GLOBAL HUB ON BIG DATA & DATA SCIENCE, HANGZHOU

UN GLOBAL PLATFORM

UNGP COMMITTEE

**EARTH** 

**OBSERVATIONS** 

CEBD ADVISORY BOARD

**CEBD BUREAU** 

TASK TEAMS

ACCESS TO PRIVATELY-HELD DATA

AIS DATA

SCANNER DATA

PRIVACY ENHANCING TECHNOLOGIES

TRAINING, SKILLS & CAPACITY BUILDING

DATA SCIENCE & SDG LOCALIZATION

SCIENTIFIC COMMITTEE

DATA SCIENCE LEADERS NETWORK

> MOBILE DATA



## **UN Global Platform**

# Purpose: Global collaboration on Data innovation

#### Provides:

- Access to Data
- Access to Technology services
- Access to Expertise
- Making use of Big Data possible for small offices



# Data

#### **Global data**

**AIS Vessel tracking data** 

Satellite imagery data

#### **Synthetic data**

Mobile phone data

**Smart surveys** 

#### **Data as a Service**

**Trade data** 

**Shipping register data** 

**Port activity** 

**Global group registers** 

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### irror_mod.use_z = False
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# **Technology services**

#### **Cloud Services**

**AWS** 

**Google Cloud Platform** 

**MS Azure** 

Alibaba

### **Supports Services**

Cloudflare

**Net App** 

**Google suite** 

### **Developer Services**

**Jupyter Notebook** 

R, Python

Colab

# Expertise

### **Data engineers**

Cloud experts of NSO
IT experts of NSO
AWS support

#### **Data scientists**

**AIS experts** 

**Flowminder** 

**Positium** 

**Open Mined** 

**University of Tokyo** 

**Bocconi University** 

**University of Oslo** 

#### **Statisticians**

**Statistics Canada** 

**Statistics Netherlands** 

ONS, UK

**BPS Indonesia** 

**UN Statistics Division** 

**ISTAT** 

**Statistics South Africa** 

**Statistics Poland** 

**World Bank** 

**Statistics Denmark** 

**NBS China** 

**FCSC UAE** 

**NISR Rwanda** 

**IBGE Brazil** 

# Projects

#### **Projects**

**Port activity** 

**Maritime emissions** 

**PET lab** 

**ARIES for SEEA** 

Sen2Agri

**SDG** finance

**Social responsibility** 

#### **Technology stack**

.STAT

Semantic web

**AWS Cloud formation** 

**Kubernetes** 

#### **Statistical Domains**

**Transport / Trade** 

Prices, CPI

**Tourism** 

**Migration** 

**Population dynamics** 

**Information society** 

**Displacement** 

**Climate Change** 

**Environment** 

Agriculture

**SDG** indicators

**Privacy protection** 

# Task Team on Use of Earth Observations for Official Statistics

social media data and mobile device data.



Statistical agencies around the world have a strong interest in investigating the viability of using satellite

imagery data to improve official statistics on a wide range of topics spanning agriculture, the

#### ■ Task Team Report

Satellite Imagery and Geospatial Data Task
Team report

#### ■ Use Cases

- Digital Earth Africa
- Use of EO data in Agriculture Statistics of Statistics Canada

#### **More information**

#### References

- Report of the Global Working Group on Big Data for Official Statistics
- Results of the UNSD/UNECE Survey on organizational context and individual projects of Big Data
- Big data and modernization of statistical systems

### **Publications**



#### UNITED NATIONS

United Nations Statistical Commission
United Nations Committee of Experts on Big Data and Data Science for
Official Statistics (UN-CEBD)

Earth Observation Joint Task Team on Agricultural Production Statistics

Research Sub Task Team

Trusted methods: Lessons Learned and Recommendations from Select Earth Observation Applications on Agriculture

# Earth Observations for Official Statistics

Satellite Imagery and Geospatial Data Task Team report

5<sup>th</sup> December 2017

sits: Satellite Image Time Series Analysis on Earth Observation Data Cubes

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Validation and accuracy measurements

Uncertainty and active learning

Ensemble prediction from multiple models

Object-based time series image analysis

Technical annex

References

#### Analysis-ready data image collections

Analysis-ready data (ARD) are images that are ready for analysis without the need for further preprocessing or transformation. They simplify and accelerate the analysis of Earth observation data by providing consistent and high-quality data that are standardized across different sensors and platforms. ARD data is typically provided as a collection of files, where each pixel contains a single value for each spectral band for a given date.

ARD collections are available in cloud services such as Amazon Web Service, Brazil Data Cube, Digital Earth Africa, Swiss Data Cube, and Microsoft's Planetary Computer. These collections have been processed to improve multidate comparability. Radiance measures at the top of the atmosphere were converted to ground reflectance measures. In general, the timelines of the images of an ARD collection are different. Images still contain cloudy or missing pixels; bands for the images in the collection may have different resolutions. Figure 9 shows an example of the Landsat ARD image collection.

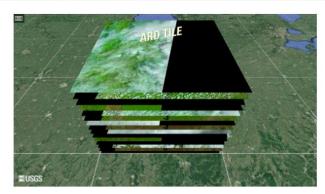


Figure 9: ARD image collection (Source: USGS. Reproduction based on fair use doctrine).

ARD image collections are organized in spatial partitions. Sentinel-2/2A images follow the Military Grid Reference System (MGRS) tiling system, which divides the world into 60 UTM zones of 8 degrees of longitude. Each zone has blocks of 6 degrees of latitude. Blocks are split into tiles of  $110 \times 110 \, \mathrm{km}^2$  with a 10 km

On this page

Earth observation data cubes

Analysis-ready data image collections

ARD image collections handled by sits

Regular image data cubes

Creating data cubes

Assessing Amazon Web Services

Assessing Microsoft's Planetary Computer

Assessing Digital Earth Africa

Assessing the Brazil Data Cube

Accessing Harmonized

Landsat-Sentinel collections

Defining a data cube using ARD local files

Defining a data cube using classified images

Regularizing data cubes

# Task Team on Use of Mobile Phone Data for Official Statistics

#### **About Mobile Phone Data**



#### Introduction

The statistical community has the obligation of exploring the use of new data sources, such as Big Data, to meet the expectation of the society for enhanced products and improved and more efficient ways of working. Use of Big Data could also support the monitoring of the Sustainable Development Goals (SDGs) by improving timeliness, frequency, detail and relevance of indicators without compromising their

■ Methodological Guides on the use of Mobile Phone Data (2022)

- Displacement and Disaster Statistics
- Dynamic Population Mapping
- · Measuring the Information Society
- Migration Statistics
- Tourism Statistics

#### **■** Publications

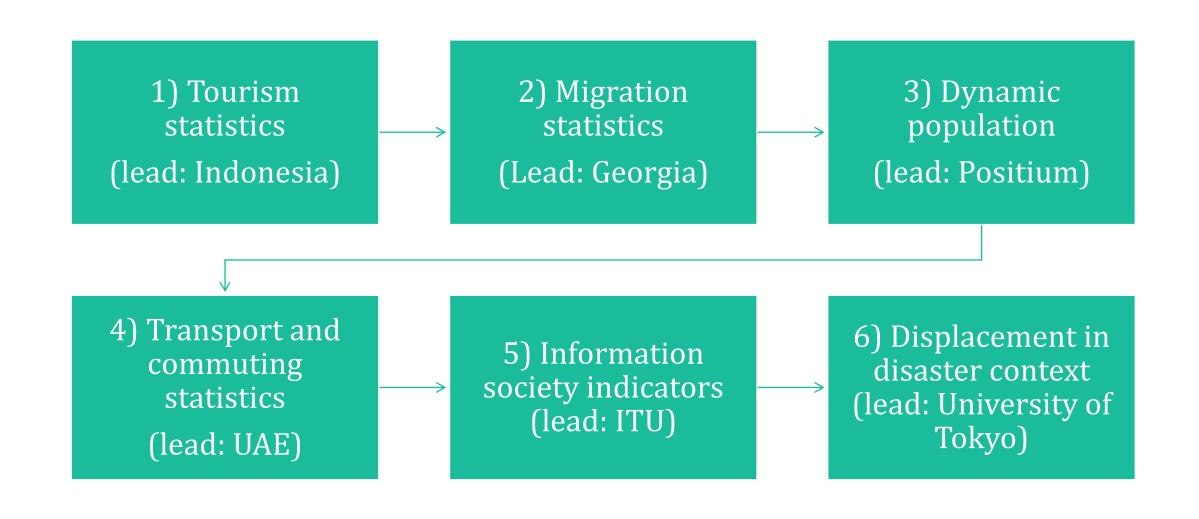
Handbook on the use of Mobile Phone data for Official Statistics (2019)

- English
- Russian

#### 

MPD Session at the 7th International Conference on Big Data

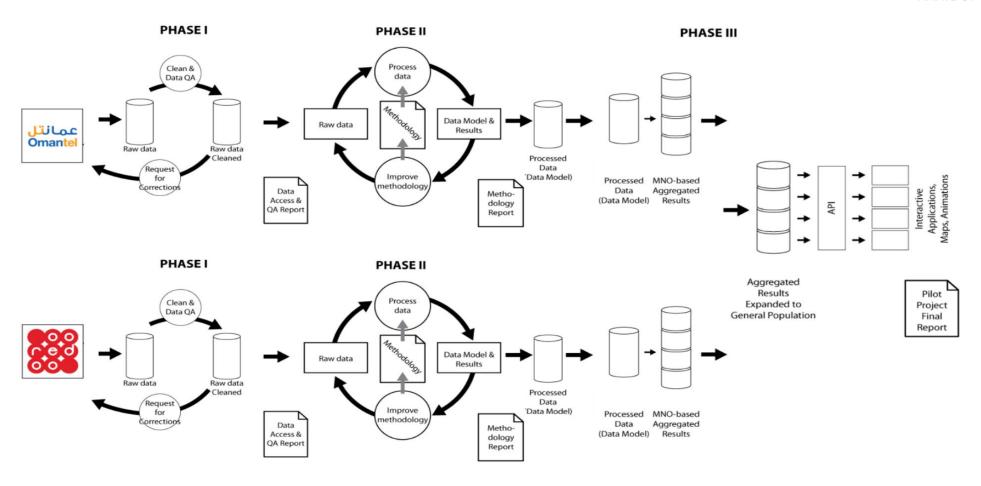
### Handbooks

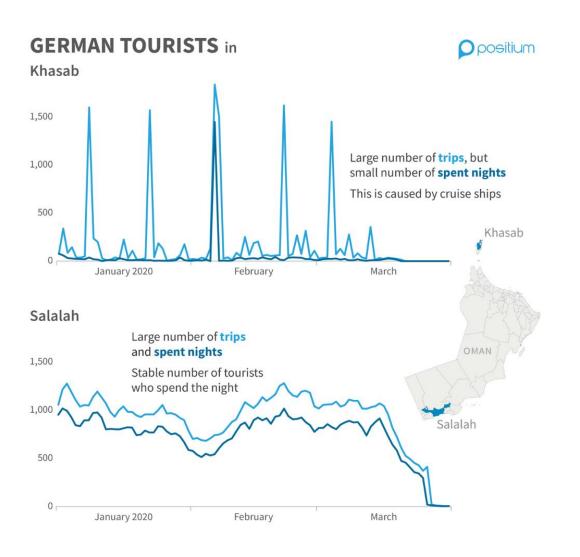


### Data Flow

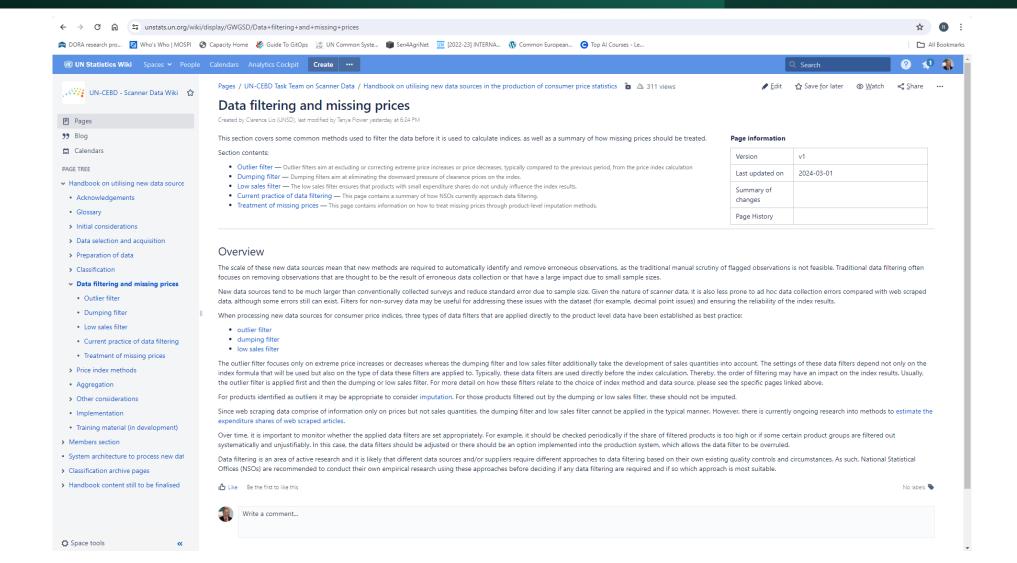


SULTANATE OF OMAN





# Task Team on Use of Scanner Data and Webscraping for Price Statistics



### Prices from digital sources









### Web Scraping data for:

- Clothing stores
- General
   Merchandisers
- Home improvement
- Electronics and Appliances

#### API data for:

- Airlines
- Hotels
- Car Rentals

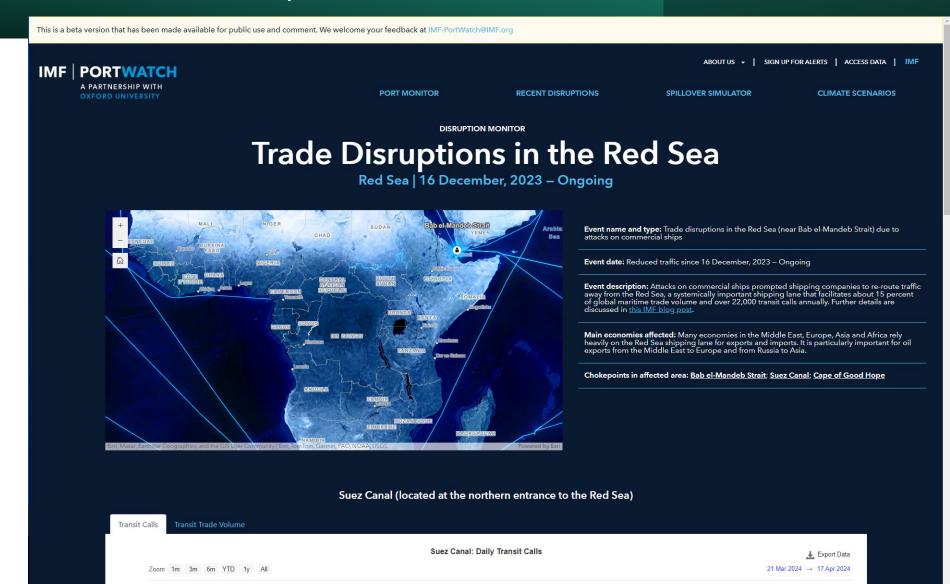
#### Scanner data for:

- Food
- Personal Care
- Household operations

### In-house Internet collection of:

- Travel
- Transportation
- Communications
- Furniture
- Services

# Task Team on Use of AIS Shipping data for Maritime Trade and Transport Statistics



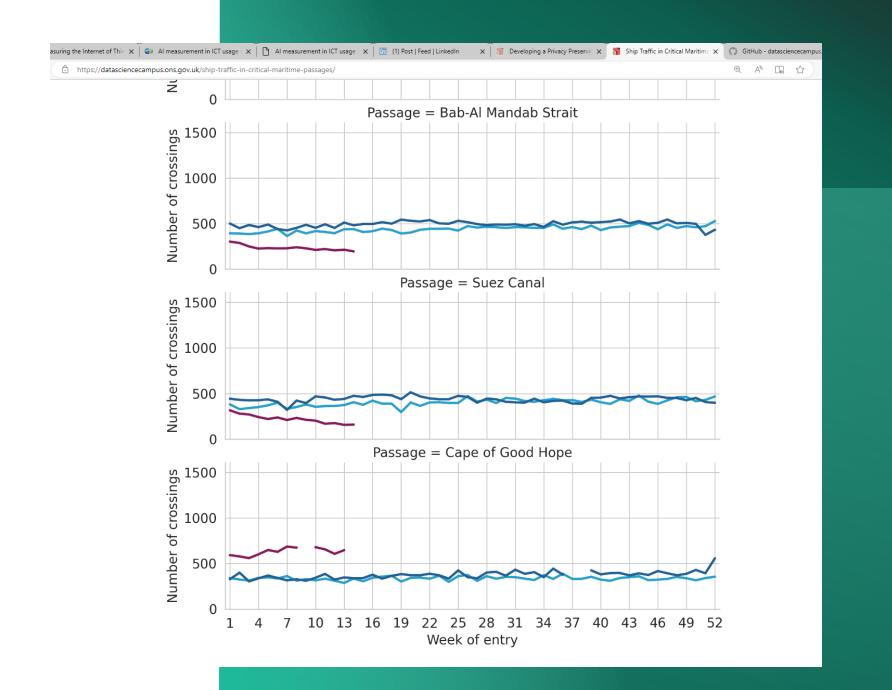
Ship Traffic in Critical Maritime Passages

Data Science Campus Department for Business and Trade

April 24, 2024

Categories: Data Science Campus, Emerging Issues, International, Trade, Shipping and Global Supply Chains





# Task Team on Privacy Enhancing Technologies for Official Statistics

#### Privacy-Enhancing Technologies

- Introduction
- Methodologies
- Case Studies
- Standards
- Legal aspects





#### CASE STUDY DESCRIPTION

#### HIGH LEVEL FUNCTIONAL PERSPECTIVE

HOSPITAL	Example features & data				INSURER	Example fea	Example features & data	
Cryptographic ID	Uses eHealth Coach?	Wellbeing Score (PROMs)			Cryptographic ID	Total Medical Costs		
1	Υ	1			1	100000		
2	N	2	***		2	5000		
3	Υ	3			3	300		
***	***	-	***		***	***	***	
uso.			4 2	5.				
ISO		mple features & c	ata					
Cryptographic ID	Education Level	Income	**					
1	3	25000						
2	5	100000	***		What is the average wellbeing score of patients using the eHealth coach with incomes above 10000 vs. below 10000? (*)			
3	1	43000		coach with inco				
***	***	-	***	vs. belov				

<sup>\*</sup>For illlustration purposes only, actual allowed queries are subject to implemented smart contract business rules

Figure 3.13: An example of Private Set Intersection with Analytics (PSI-A)

#### **Developing a Privacy Preserving Record Linkage toolkit**



Data Science Campus | April 4, 2024

Categories: Data Science Campus, Projects, Synthetic data and PETs



The PPRL toolkit demonstrates a layered approach to security, which has been called the 'Swiss cheese' model

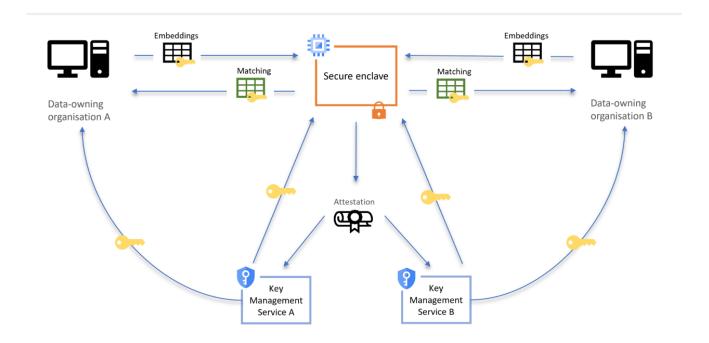
#### Overview

The Office for National Statistics (ONS) – along with other public sector institutions – rely on the ability to link datasets to produce new analysis and improve statistics for decision-making. As Sir Ian Diamond, the National Statistician, says "We find ourselves living in a society which is rich with data and the opportunities that comes with this. Yet, when disconnected, this data is limited in its usefulness. ... Being able to link data will be vital for enhancing our understanding of society, driving policy change for greater public good and minimising respondent burden."

Data linking often needs to happen across organisational and national boundaries, which can create data privacy risks as personal information such as names, addresses, and dates of birth are often needed to do this accurately. The ONS takes very seriously its responsibility to link datasets securely, ethically and robustly, and is taking a leading role in exploring how new technology can help us achieve this.

Today, we are releasing an experimental Privacy Preserving Record Linkage toolkit, which we hope will help organisations with

Figure 1: Example diagram for the PPRL server architecture



This approach to overlapping security has been called the "Swiss cheese" model: imagine thin layers of Emmental, stacked so that the holes in one layer are covered by the next layer. The approach is designed to take advantage of several layers of security. It uses a combination of algorithms, encryption, and secure cloud technologies that reinforce each other and ensure that sensitive information cannot be recovered by those who should not see it.

#### **Toolkit**

Our design focuses on minimising the amount of infrastructure configuration for data owners, as we wanted the toolkit to be as simple as possible to use. The first element of the toolkit is a Python package that implements an experimental private data linkage algorithm. The algorithm uses trainable hash embeddings to compare and match datasets. Python users can download

# Training in Big Data and Data Science for official statistics





**Big Data Training Curriculum** 



**E-Learning Courses** 



**Big Data Maturity Matrix** 



Training of data scientist in academic centers



**Big Data Competency Framework** 



Mentorship

### Data Science Leaders Network

- Automation of the statistical production processes (increase efficiency and improve quality)
- Supplementary indicators produced for emerging issues to provide additional insights
- Changing statistical production:
   Example webscraping of prices from the internet combined with traditional price surveys to produce regular consumer price indices

Reproducible analytical pipelines

Supplementary analysis and insights

Transformation of Statistical Production Process



### **UNCEBD** partners with about 100 institutes









































Statistics Canada







# Survey: 10-year review on use of Big Data

# Big Data and Data Science for Official Statistics



# Geographical breakdown of institutes

Africa	14
Asia	21
Europe	30
Latin America and the Caribbean	9
Middle East	7
North America	2
Oceania	4

# Questions for Survey and Interview

# GAMSO structure of the Survey (Generic activity model of statistical organizations)

- strategic vision,
- legislation,
- institutional arrangement and partnerships,
- data sources,
- methodology and quality assurance,
- communication and stakeholders' consultations,
- human resources,
- IT management

# Categories of the interview questions

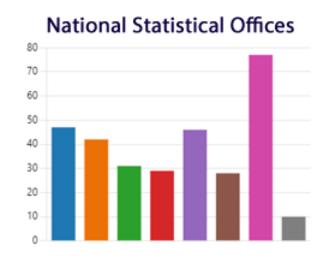
- UNCEBD mandate and value proposition
- Terms of References of the task teams and the regional hubs
- UN Global Platform
- Communication
- Strategic Framework
- Organizational adaptability
- Use of new data sources

# Strategic Vision

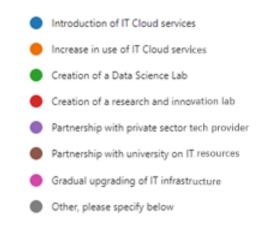


### High-level goals of multi-year plan Please check all those topics below which are part of your innovation strategy

# IT Management







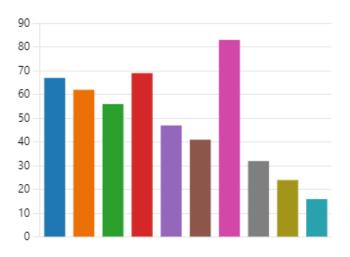
#### 38. Infrastructure

Which of the following options describes the change of technology infrastructure in your institute for the processing of alternative data sources, like Big Data?

You can choose more than one option

# New Data Sources

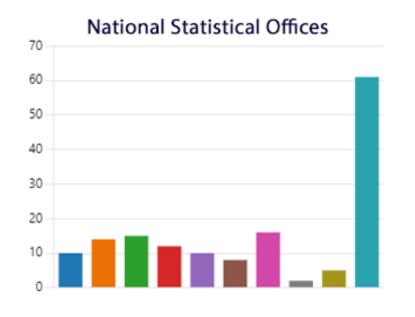
•	Satellite data	67
•	Mobile phone data	62
•	Retail store scanner data	56
•	Webscraping data	69
	Credit card / Payment card data	47
	Citizen generated data / Citizen	41
•	Additional administrative data (	83
	Smart meter data	32
•	Other private sector data, pleas	24
•	Other data sources, please speci	16



### 20. Alternative data sources, including Big Data or webscraping and other privately held data

What other data sources do you use or are you considering using in the future?

# Task team participation – in which task teams has your office been actively participating





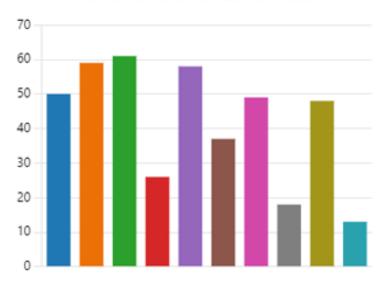
- Task Team on use of Mobile Phone data for official statistics
- Task Team on use of Scanner data and webscraping for price statistics
- Task Team on use of AIS vessel tracking data for maritime transport and trade statistics
- Task Team on the use of Privacy Enhancing Technologies for official statistics



- Task Team on Training, Competencies and Capacity Development
- Task Team on Big Data for Sustainable Development Goals
- Task Team on Rural Access to All-season roads
- Task Team on Facilitating Access to privately held data
- None of these task teams

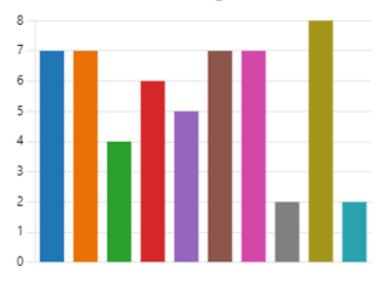
# Task teams of interest – in which task teams would your office be interested to participate

#### National Statistical Offices



- Task Team on use of Satellite Data for agriculture statistics
- Task Team on use of Mobile Phone data for official statistics
- Task Team on use of Scanner data and webscraping for price statistics
- Task Team on use of AIS vessel tracking data for maritime transport and trade statistics
- Task Team on the use of Privacy Enhancing Technologies for official statistics

#### International Organizations



- Task Team on Training, Competencies and Capacity Development
- Task Team on Big Data for Sustainable Development Goals
- Task Team on Rural Access to All-season roads
- Task Team on Facilitating Access to privately held data
- None of these task teams

# Summary of Survey Results



Almost 4 out of 5 NSOs have explicitly incorporated references to modernization, innovation, data science, and the use of big data, into their strategic agendas.



Access to private sector data together with protection of data privacy are main priorities in the innovation strategies.



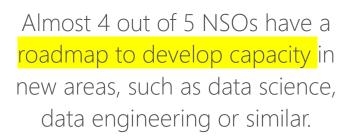
Correspondingly, more than 4 out 5 NSOs have updated or are in the process of updating their statistical legislation to facilitate access to privately held data.



About half of NSOs and IOs are actively developing data science capabilities in their institutes.

# Summary of Survey Results







Whereas most NSOs have gradually upgraded their IT infrastructure, only about half using Cloud services.



About 2 out of 3 NSOs have not yet participated in the UNCEBD task teams but all are interested to join in one of the task teams.

### Recommendation – Communication

It is recommended that the communication of UNCEBD will be improved through

- user-friendly upgrades and consistent content updates of the UNCEBD website,
- improving the organization of the international conferences, and
- streamlining communication tools, such as newsletters, social media, and more focused content.

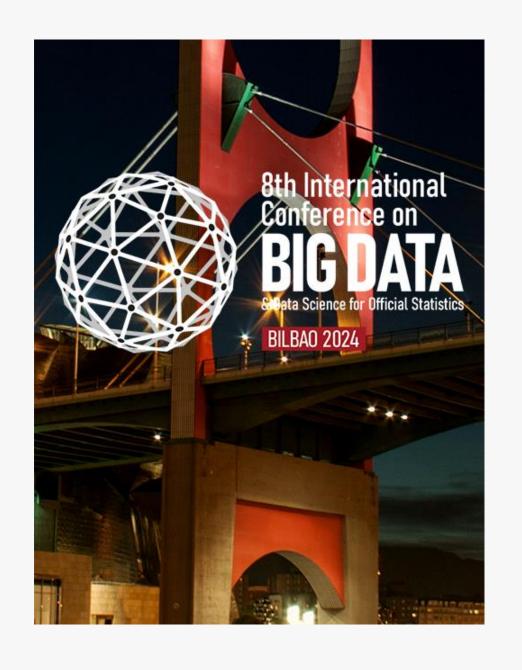
# Recommendation – Updating the UNCEBD mandate

The mandate of UNCEBD is to provide strategic vision, direction and coordination for a global programme on the use of data science, Big Data and other alternative data sources for official statistics. Within this global program UNCEBD should:

- conduct use cases, while facilitating data access and protecting data privacy;
- develop solutions for many methodological, technical and legal challenges;
- promote capacity-building activities;
- promote partnerships with private sector and academia;
- promote the integration of statistical and geospatial information;
- develop communication strategies to maintain public trust.

### What is next?

- More Data Science and Al
- More Partnerships across the Data Landscape
- Data Governance
  - Equal access to data
  - Privacy enhancing technologies & improved data sharing & risk/cost of not-sharing
  - Information integrity & data ethics



8<sup>th</sup> International Conference on Big Data and Data Science for official statistics

Informing Climate Change and Sustainable Development policies with integrated data

Venue: Euskalduna

Conference Centre,

Bilbao, Spain

Dates: 10 to 14 June 2024