

## Utilização de fontes *Big Data* para a produção das Estatísticas Oficiais

25ª Reunião Plenária do CSE - Lisboa, 02 de Julho de 2018

# BIG DATA

### Lots of fish at sea



### Which can be used!!!

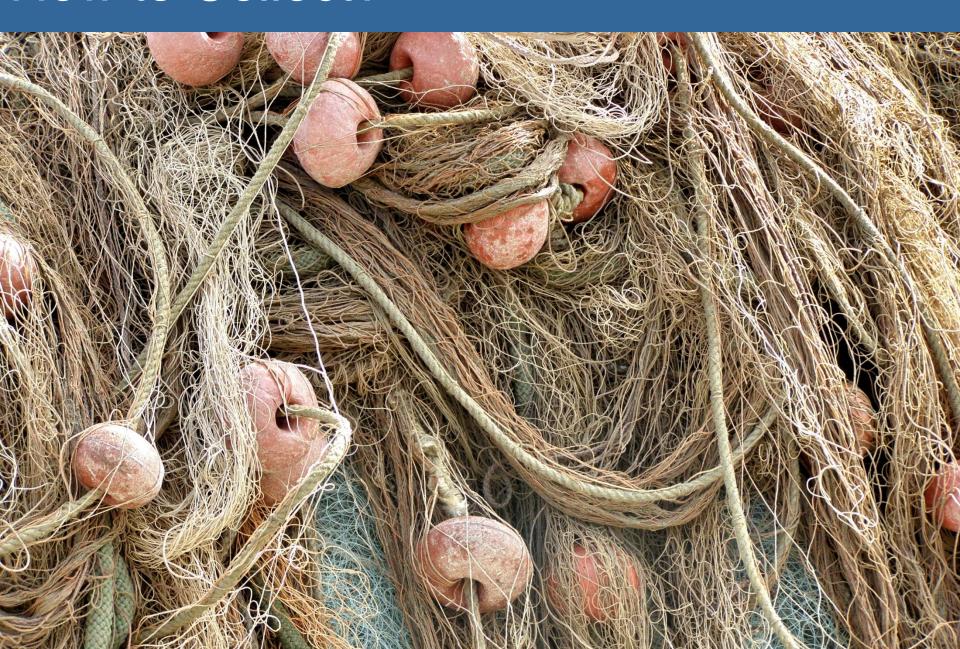


# Questions?

### Where to look?



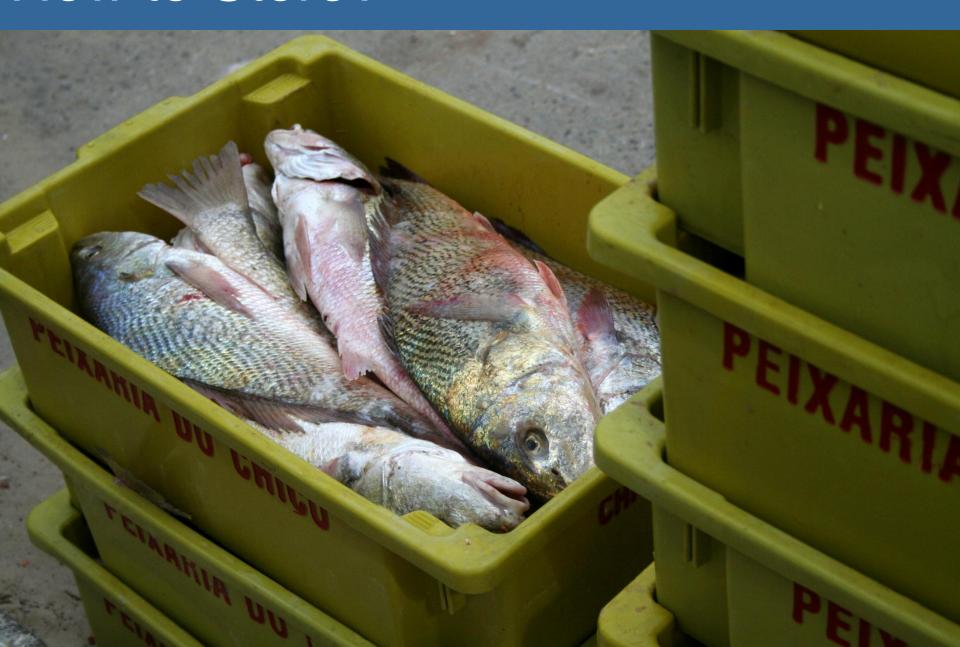
### How to Collect?



### How to Process?



### How to Store?



### How to Analyze?



### Data Driven Models?



### How to Keep Efficiency?



# PROJECTS

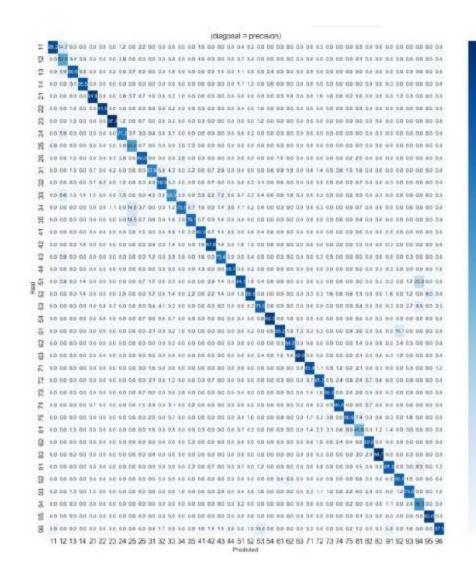
# ESSnet on Big Data

### Phase one - Jan/17 to May/18

- From January 2017 to May 2018
- Involved in several work packages
- Using different sources/methods and approaches

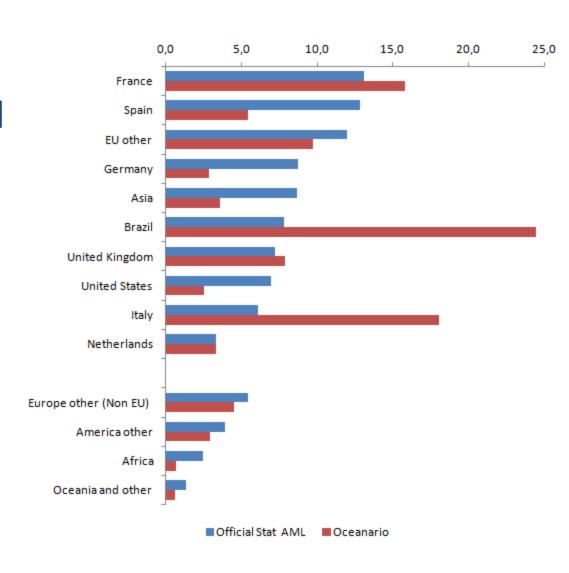
### Web Scrapping / Job Vacancies

- Web scrapping
- Text analysis and classification
- Machine Learning SVM with Linear Kernel
- Techniques usable for classification problems not only on Big Data



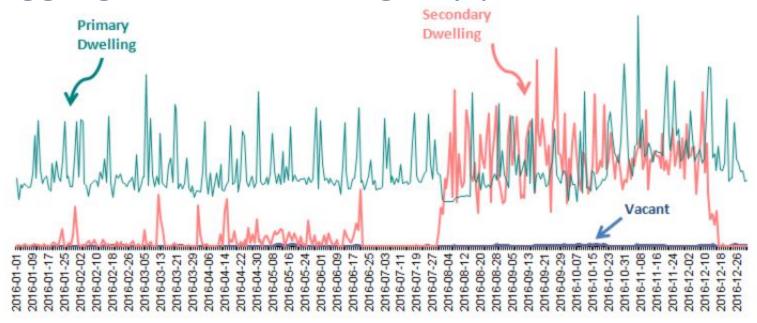
### Web Scrapping / Tourism

- Web scrapping for content –static and dynamic
- Processing clean and normalize
- Classification Tasks
- Language review
- Data Analysis for example why is Brasil over represented?



### Smart meters / Electricity Consumption

- Use electricity consumption to classify dwellings as primary, secondary or vacant
- Clustering techniques used
- Aggregated data Linkage by postal code



#### SAR / Economic Indicators

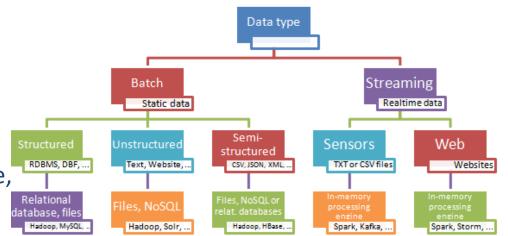
- Volume of exports (INE, 2018), and overnight stays, both collected at NUTS III level as predictors
- Use time series with quarterly data from 2007 to 2017, for 23 different regions, where with each time series having 40 time periods
- SAR (Spatial Autoregressive) is used

#### Results of the models

Models	Components	Equation	Results
Simple Linear Regression		$Y = \beta_0 + \beta_1 * Nights + factor(região) + \varepsilon$	$R^2 = 0.933$
	Region	$Y = \rho W_Y + X\beta + \varepsilon, \ \varepsilon \sim N(0, \sigma^2 l)$	$R^2 = 0.941$
SAR (Spatial autoregressive			AIC = 154772.1
model)	Region and time	$Y = \rho W_Y + X\beta + \varepsilon, \ \varepsilon \sim N(0, \sigma^2 I)$	$R^2 = 0.953$ AIC = 154119.4
SEM (spatial error model)	Region	$Y = X\beta + u$ $u = \lambda W_u + \varepsilon, \ \varepsilon \sim N(0, \sigma^2 I)$	$R^2 = 0.936$
	Region and time	$Y = X\beta + u$ $u = \lambda W_u + \varepsilon, \ \varepsilon \sim N(0, \sigma^2 I)$	$R^2 = 0.952$

### Methodology

- Methodology Issues:
  - Coverage, accuracy, etc
- Quality Issues:
  - Measurement error, Linkability, etc
- IT issues:
  - Data source integration, processing, big data life cycle, fit to GSBPM
- Crosscut issues to all projects that must include big data for official statistics production



### Big Data Hackathon 2017

#### Subject: Help tackling Skills mismatch in EU

- "Skills development are essential in the emerging new economy and fast-changing labour market"
- "Qualification and skill mismatches entail significant economic and social costs for individuals and firms"
- Data: Eurostat datasets; webscrapped data from job portals
- Aim: help policy makers, job providers and/or jobseekers
- Organization: Eurostat and CEDEFOP
- 5th place in 22 EU teams (13th-15th March 2017, Brussels)

### Big Data Hackathon 2017

#### Project:

- Develop concept of Labour Market Attractiveness.
- Comprehensive and scalable framework to: visualize labour market datasets; cluster EU regions; construct Eigenvariables; and establish associations between relevant indicators and characteristics of the labour market.

#### Side-results:

- Presented in 3 academic conferences
- 1 Statistical Working Paper and 1 Conference Proceeding
- https://github.com/jsollari/EUhackathon2017
- http://ec.europa.eu/eurostat/web/products-statistical-working-papers/-/KS-TC-18-002

### ESSnet on Big Data – Phase Two



### Phase Two – Nov/18 to Nov/20

- submission date 20<sup>th</sup> of September
- From November 2018 to November 2020
- Possibility of Involvement in several areas
- Invited to lead a Work Package

### Phase Two - Nov/18 to Nov/20

#### Work Packages will cover:

- 1. Implementation
- 2. Research and Development
- 3. Study and Exploration

### Phase Two - Nov/18 to Nov/20

#### The call being prepared

Description	Countries interested	
	Number	Designation
Use of financial transactions	4 to 5	BG, (IT), NO, PL, <b>PT</b>
data		
Remote sensing	5 to 6	DE, FR, (IT), PL, <b>PT</b> , SK
Mobile network operator data	13	
Innovative sources and methods for tourism statistics	8	AT, DE, DK, GR, IE, PL, <b>PT</b> , SK

### Phase Two - Nov/18 to Nov/20

#### The call being prepared

Description	Countries interested	
	Number	Designation
Broader View	8	IT, BG, SE, FR, DK, NO, PL, <b>PT</b>
InDepth view - smart farming	3	AT, PL, <b>PT</b>

# Call to FCT on Modernization

## Challenges



DANGER OF DANG CLOSING MEYNOTE The Rise of The Design-Smart City [tim Horton] FOROWTHEN & CHANGE HOWCAN BEST WAY Spiral. Interpoled DEST TO PREDZET CHANGE EXCENENCE Luchars THIS THE Future is Allowed to SYCIAKUNE 40 to Design it COMMISIN DEGIGN ED ((my) C3 S: milar Agencies QUESTION STUHY NOT Singa pone CARE (London) ) hindeina Hersonki. the Ulorgunious Casponlithy Indovotion INNET "ROJECT" GOUT - G (8 CONTILS) = SOOD PROJECT CAN'T DO TOP LAN Trees CONCERNS MHENJIS 4900 CHARACTER Agod Care Cost - DEVERSE AREAS (alle) BINCETU

#### Project information:

- 36 months duration
- Use Big Data primarily from sensors
- Focus on the city of Lisbon
- Multidisciplinary team from INE and university – 5 internal researchers

#### Project statistical aims:

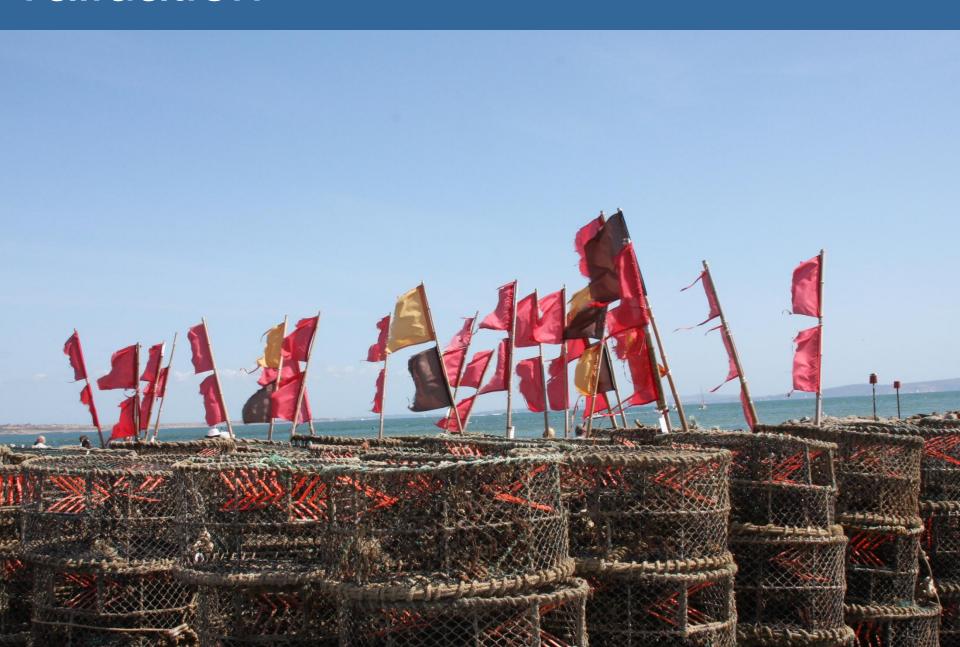
- Knowing how people move in Lisbon
- Identify the patterns of commuting, longer and shorter movements to assess the quality of life in the city
- Realize the intensity of traffic and transport
- Predict and anticipate how events disturb the city

#### Project generic aims:

- Endow INE with a structure capable of dealing with big data in terms of storage and processing
- Enable INE's human resources to use data analytics and big data
- Include data discovery, machine learning and deep science techniques in the processing methods available at INE
- Gain new ways of visualizing data appropriate to the challenges that big data poses to INE

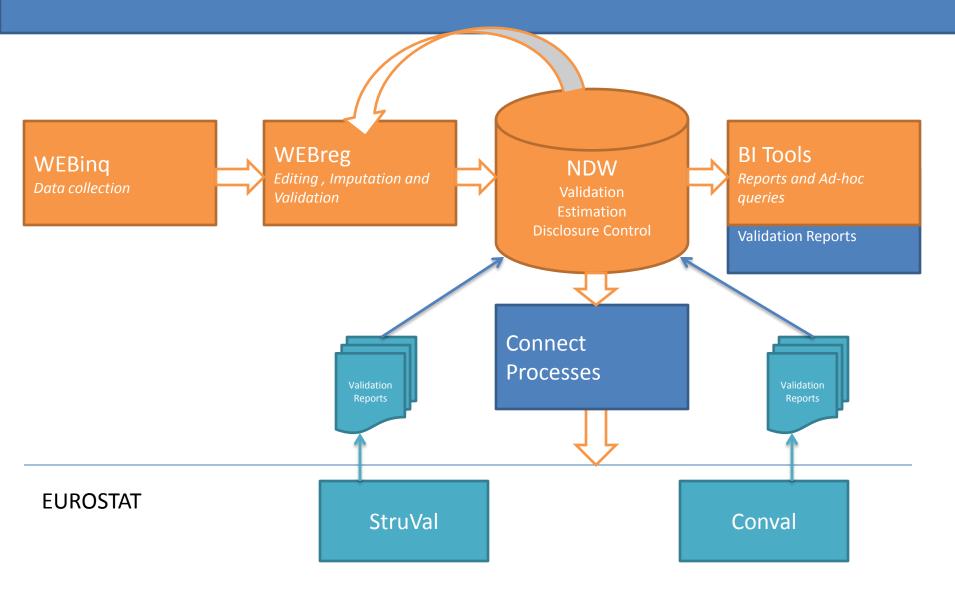
# ESSnet on Validation

### Validation



## Situation at INE





## Validation – Jan/17 to Feb/18

- From January 2017 to February 2018
- Leadership of the Work Package on Implementation
- Leadership of the Work Package on accessing the cost benefit analyses of the validation tools
- Development of multi-criteria tool for cost/benefit analyses

## Validation – Jan/17 to Feb/18

Covered the scenarios for data validation of the Business Architecture for the ESS

- Structural Validation
- Content Validation
- EDAMIS

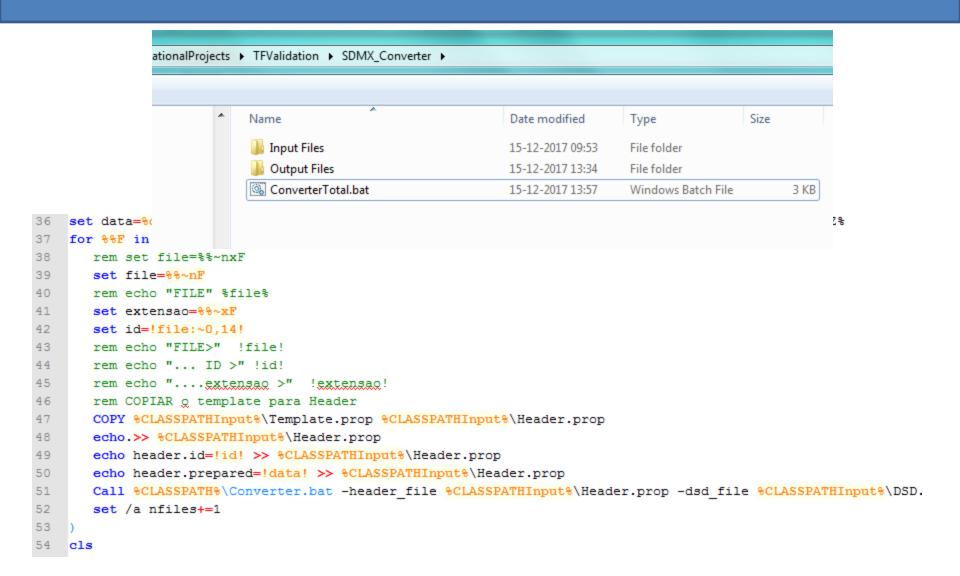
## Validation – Jan/17 to Feb/18

#### **Results:**

- Assessments on <u>Structural</u> Validation
- Assessments on <u>Content</u> Validation
- Assessments on VTL language
- Pilot Automation of the Structural and Content Validation for the National Accounts

## We've automated the process



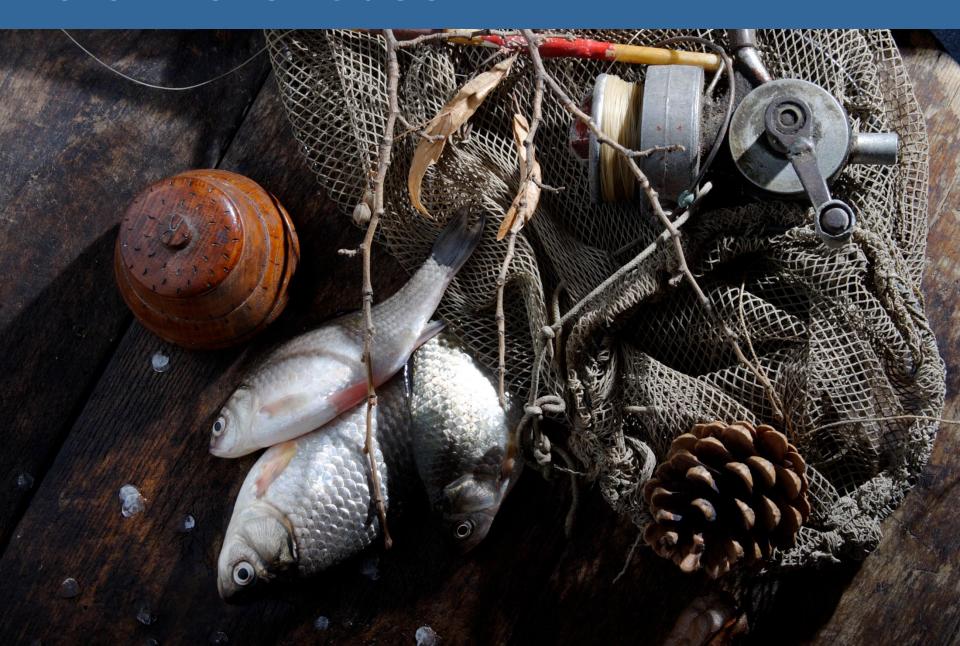


## Validation – Jan/19 to Dec/19

- From January 2019 to December 2019
- Single grant agreement
- Extending validation of the outputs to other domains: Agriculture
- Compare validation rules in VTL and SQL to achieve a template with the core rules that cover 80% of the rules adopted by Eurostat

# Centre of Excellence on SDW

## Data Warehouse



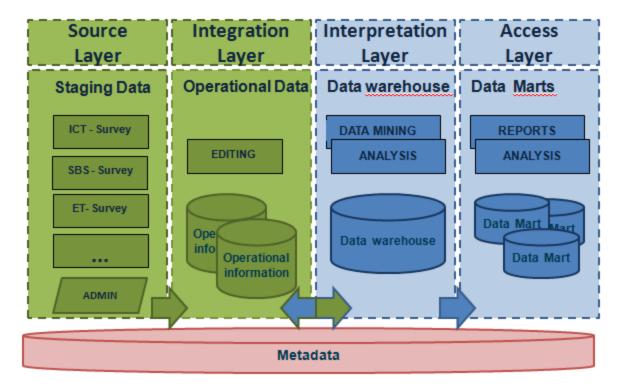
## CoE on Statistical Data warehouse

- From November 2016 to November 2018
- IV mandate in the Centre of Excellence on Data Warehouse, after 3 ESSnets (since 2011)
- Internships since 2015 in the data warehouse area recognizing our Best Practices

## CoE on Statistical Data warehouse

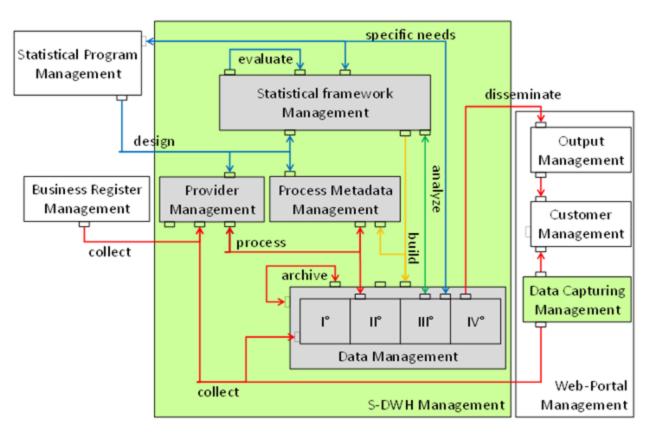
#### Lines of Work:

Documenting of Best practices in the ESS countries

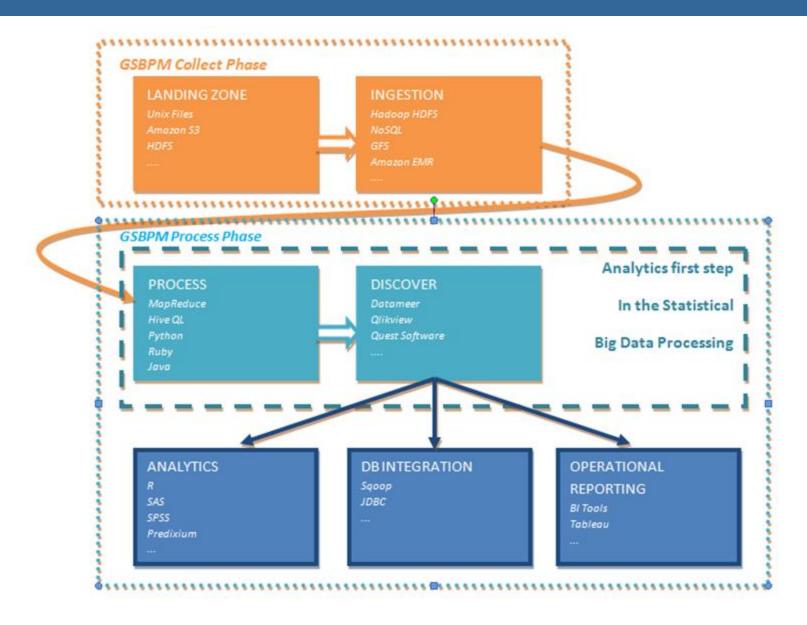


## CoE on Statistical Data warehouse

## Preparing a Handbook for implementing a Statistical Data Warehouse

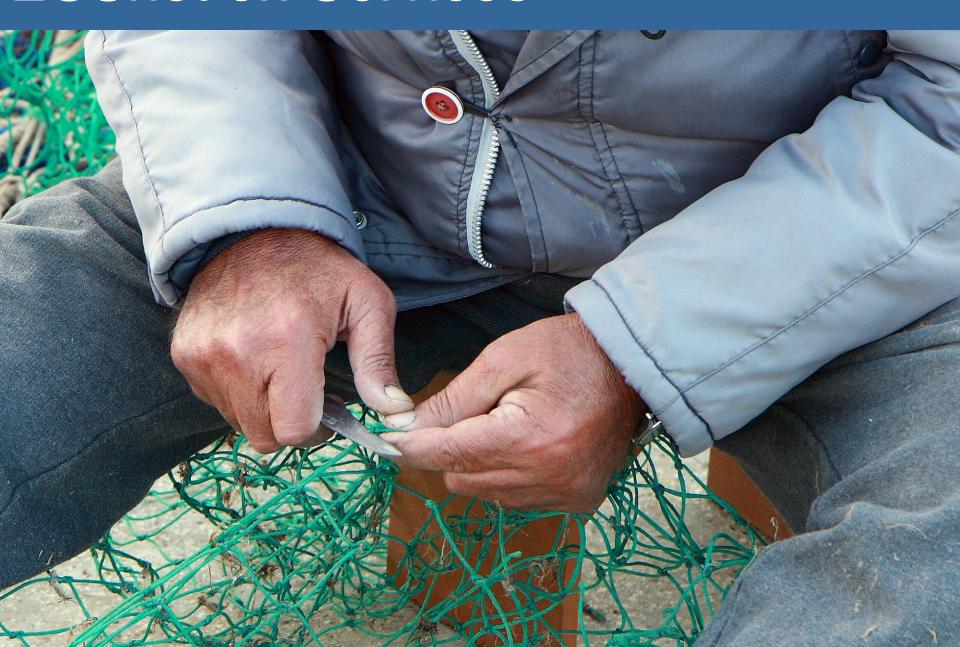


## Big Data Conceptual Platform



## ESSnet on Services

## ESSnet on Services



## **ESSnet on Services**

- Call submitted on the 27<sup>th</sup> June
- Duration 24 months
- Focus on:
  - Services development and reuse
  - Understand the barriers to services reuse
  - Build on success stories to promote services reuse across the ESS

### ESSnet on Services – Dissemination WP

Task/Work package number	4		Mont Month									T+1 T+2	4	
Title	Newsletter													
Partner	l (bold for leader)	2	3	4	5	6	7	8	9	10	11	12	13	

Objectives Increase the awareness in the countries of the ESS to the results of this ESSnet

#### Description of work

During the intermediate months create a newsletter following the major developments, drawbacks an successes of the services inside this essnet.

#### Sub-Tasks:

- Investigate every work package in the essnet with a differente perspective creating a narrative for each
- Follow up on particular details and facts
- Prepare and write the newsletters

#### Deliverables

Newsletters

Task/Work package number	4		Mont Month									T+1 T+1	8	
Title	Experts meeting													
Partner	l (bold for leader)	2	3	4	5	6	7	8	9	10	11	12	13	

Objectives Bridge the gap between Service developers and re-users

#### Description of work

Investigate why there are more candidates to services development than to service re-use.

#### Sub-Tasks:

- Organize "Mind the Gap" meetings
- Uncover the barriers to services re-use
- Discover ways to overcome those barriers
- Collect and build on sucess stories on services re-use

#### Deliverables

Report on "Mind the Gap" solutions

Distribution of man power for the duration of the action

### ESSnet on Services – Dissemination WP

Task/Work package number	4		Start Month: End Month:									T+1 T+12		
Title	Survey													
Partner	l (bold for leader)	2	3	4	5	6	7	8	9	10	11	12	13	

Objectives Know the current status and maturity of the countries in the ESS toward service adoption

#### Description of work

Elaborate a survey with the aim of knowing the current status and maturity of the countries in the ESS towar service adoption, and the areas and processes where those will be most needed or required.

#### Sub-Tasks:

- Prepare the survey
- Run the Survey
- Treat the survey results
- Disseminate the survey results

#### Deliverables

Report on the results of the survey

Task/Work package number	4		Start Month: End Month:								T+1 T+24			
Title	Sinder													
Partner	l (bold for leader)	2	3	4	5	6	7	8	9	10	11	12	13	

Objectives Develop a way to let NSIs discover the Services most suited to their profile

#### Description of work

Based on the results of the survey cluster typical profiles and develop a binary tree to guide a NSI toward the Services that suit them.

#### Sub-Tasks:

- Create the typical profiles
- · Categorize the services
- Create a yes/no workflow Sinder

#### Deliverables

Report on Sinder and Sinder itself

# Data Analytics

## Data Analytics



## Data Analytics

- First preparatory meeting May 2018
- First conference September 2018
- Focus on:
  - How to use machine learning for official statistical production
  - What does using Big Data requires from data analytics at the NSIs
  - Can a Logical Statistical Data warehouse (LSDw) assists us on the process?

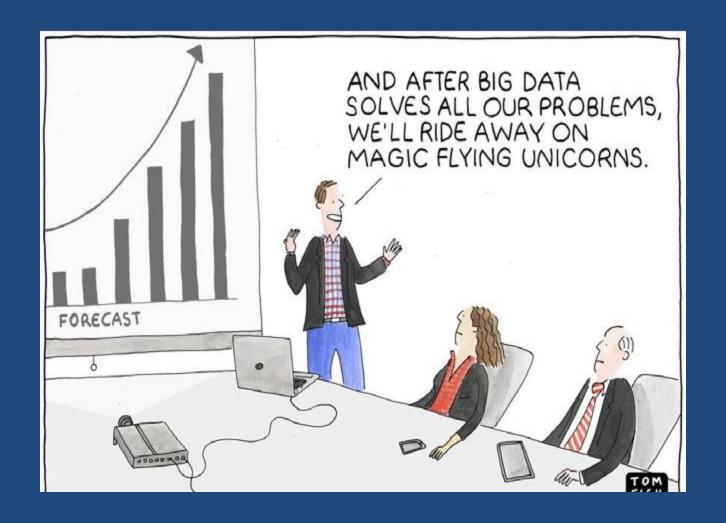
# Trusted Smart Statistics

## Trusted Smart Statistics



## **Trusted Smart Statistics**

- First conference April 2018
- Second conference January 2019
- Focus on:
  - How can smart statistics overcome by aggregation of data some legal issues that big data poses?
  - Smart data coming from sensors is less prone to change than a website and so more dependable to produce official statistics
  - Which methods to ensure coverage, accuracy and measurement error should be applied to Smart Statistics to make them Trustable?



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