

# PHIRI

Population Health Information  
Research Infrastructure

# PHIRI Federated Research Infrastructure

17<sup>th</sup> World Congress on Public Health – A World in Turmoil  
Opportunities to Focus on the Public's Health

ROBERT KOCH INSTITUT



Instituto Aragonés de  
Ciencias de la Salud

[www.phiri.eu](http://www.phiri.eu)



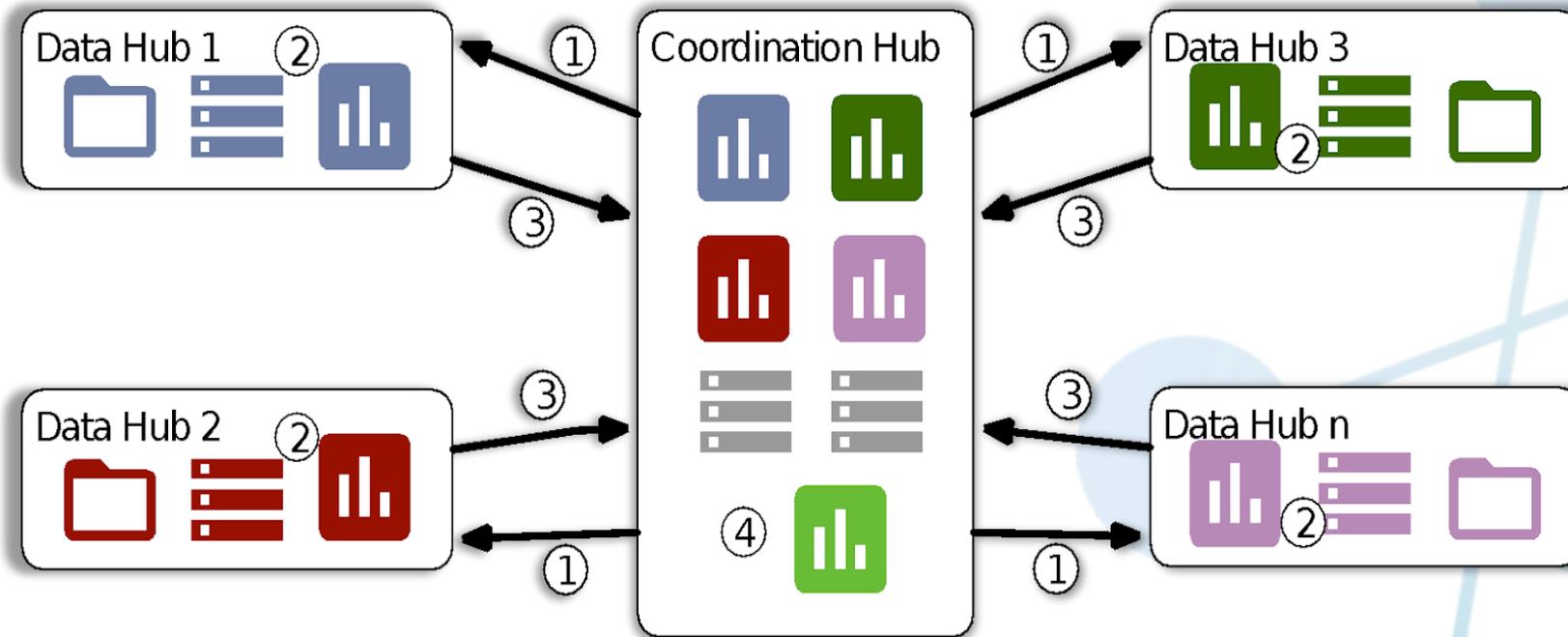
This project has received  
funding from the European  
Union's Horizon 2020  
research and innovation  
programme under grant  
agreement No 101018317

# Principles of the PHIRI research infrastructure

- **Research Question**
- **Secondary use**
- **Sensitive Health Data**
- Common Data Model (**CDM**)
- Security & **privacy by design**
- “**Code meets data**”
- Enabling **rapid-cycle** analyses

- **Federated**
- **Open source** (software/stack)
- **Literate statistical programming**
- **Usability** (easy-to-use interfaces)
- **FAIR (stemming from R to F)**
- Aligned with advances towards **Federated Learning**

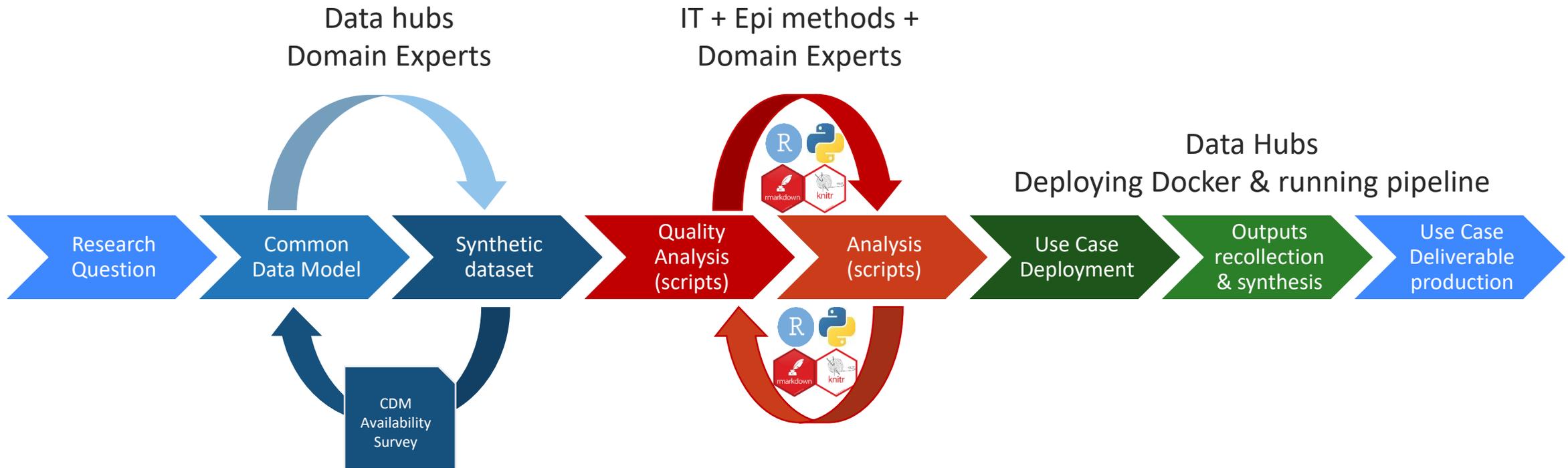
# Federated architecture



# Federated, secondary use, “codes meets data” strong reliance on interoperability



# Strict workflow enabling LOST interoperability



Orchestration of research query and deployment



# Common data model

PHIRI Federated Analysis Application (Docker)

Common Data Model

Synthetic dataset

Quality Analysis (scripts)

Analysis (scripts)

Outputs recollection & synthesis

| Data model entity  | Variable                     |  |                    |  |                         |         |  | Data Quality                             | ETL   |                                      |
|--------------------|------------------------------|--|--------------------|--|-------------------------|---------|--|--|---|--------------------------------------|
|                    | Associated entity in ERD     | Label (var_label)  | Name (var_concept) | Level (required/recommended/optional)                      | Classification/Encoding | Units   | Format   | Description                              | References to validation rules  | Transformation at or                 |
| patient            | patient_id                   | patient identifier   | required           | private key ciphering function                             | none                    | string  | patient pseudonymized identifier   | SHI256                                   | double hash function a following SHA256 prot (see patient cohort defn in next sheet)  | field calculated at individual level |
| patient            | age_nm                       | age  | required           | none   | years                   | integer | patient's age at the moment  | 3-digits; min 18; max 80                 | it might need to be calc from 'birth_dt'  | field calculated at individual level |
| patient            | soecon_lvl_cd                | socioeconomic level  | recommended        | quintile   | quintiles               | integer | patient's socioeconomic level (quintile)   | min 1; max 5                             | it might need to be calc from 'income_lvl' or approximated through a combination of 'education_lvl' and other variables   | field calculated at individual level |
| patient            | country_cd                   | country (residence)  | required           | ISO3166  | none                    | string  | patient's country of residence   | ISO3166-3                                | conformance with ISO3166-3  | field calculated at individual level |
| patient            | country_origin_cd            | country (origin)   | recommended        | ISO3166  | none                    | string  | patients' country of origin  | ISO3166-3                                | conformance with ISO3166-3  | field calculated at individual level |
| procedure          | ttm_type_cd                  | type of treatment  | required           | types of treatment referred below or a combination of them | none                    | integer | type of treatment received by the patient  | values restricted to existing categories | calculated following treatment type definition (see definitions in next sheets)   | field calculated at individual level |
| procedure          | time_dx_to_surgery_nm        | [time til first surgery]   | required           | none   | days                    | double  | time from breast cancer diagnosis to first surgical procedure  | no negative values allowed               | it might be calculated as the difference between the date of the breast cancer diagnosis and the first surgical procedure related to the breast cancer treatment (see definitions in next sheets) | field calculated at individual level |
| procedure          | time_dx_to_radiotherapy_nm   | [time til first radiotherapy session]  | required           | none   | days                    | double  | time from breast cancer diagnosis to first radiotherapy session                                      | no negative values allowed               | it might be calculated as the difference between the date of the breast cancer diagnosis and the first radiotherapy session (procedure) (see definitions in next sheets)                          | field calculated at individual level |
| procedure          | time_dx_to_chemotherapy_nm   | [time til first prescription/administration of a chemotherapy treatment]                     | required           | none   | days                    | double  | time from breast cancer diagnosis to first prescription/administration of a chemotherapy treatment   | no negative values allowed               | it might be calculated as the difference between the date of the breast cancer diagnosis and the prescription/administration of chemotherapy treatment (see definitions in next sheets)           | field calculated at individual level |
| procedure          | time_dx_to_immunotherapy_nm  | [time til first prescription/administration of a immunotherapy (a.k.a biological) treatment] | required           | none   | days                    | double  | time from breast cancer diagnosis to first prescription/administration of a immunotherapy treatment  | no negative values allowed               | it might be calculated as the difference between the date of the breast cancer diagnosis and the prescription/administration of immunotherapy treatment (see definitions in next sheets)          | field calculated at individual level |
| drug exposure      | time_dx_to_hormonotherapy_nm | [time til first prescription/administration of a hormonotherapy treatment]                   | required           | none   | days                    | double  | time from breast cancer diagnosis to first prescription/administration of a hormonotherapy treatment | no negative values allowed               | it might be calculated as the difference between the date of the breast cancer diagnosis and the prescription/administration of hormonotherapy treatment (see definitions in next sheets)         | field calculated at individual level |
| observation period | period                       | [time period]  | required           | none   | month                   | integer | natural month  | yyyy-mm                                  | calculated as the natural month in which each patient received any of the aforementioned types of treatment   | field calculated at aggregated level |



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**Use Case B - Delayed care in cancer patients**

This survey aims at mapping the availability of individual level data at each data hub to answer the research question posed by the Use Case B.

**\*\*Research question\*\***  
Has there been any increase in surgical and/or co-adjvant (i.e. radiotherapy, chemotherapy, immunotherapy) treatments delay in eligible women diagnosed with breast cancer, as a consequence of the COVID-19 crisis?

**\*\*Cohort description\*\***  
Women, 18 years old or older, with a first diagnosis of breast cancer between 2017-01-01 until today.

**\*\*Individual level data is required\*\***

**\*\*Common data model\*\* includes variables on:**  
patient identifier  
age  
socioeconomic level  
country (residence)  
country (origin)  
type of treatment (surgery, radiotherapy, chemotherapy, immunotherapy, hormonotherapy or a combination of several)  
time til first surgery (days)  
time til first radiotherapy session (days)  
time til first prescription/administration of a chemotherapy treatment (days)  
time til first prescription/administration of a immunotherapy (a.k.a biological) treatment (days)  
time til first prescription/administration of a hormonotherapy treatment (days)  
time period (month)

You can explore the Common Data Model specification at <https://docs.ozonics.com/cdm-specification/2024-04-09/3.2-Entity-ISO3166-3-Data-Model-Use-Case-B>

**\*\* Note that you can comment directly on the Common Data Model through the link.**

Your comments on any issue regarding the data model will be much appreciated!



# Synthetic dataset

PHIRI Federated Analysis Application (Docker)

Common Data Model

Synthetic Dataset

Quality Analysis (scripts)

Analysis (scripts)

Outputs recollection & synthesis

|    | A          | B           | C      | D                     | E                          | F                          | G                            | H                           | I      | J              | K          | L                 | M           |
|----|------------|-------------|--------|-----------------------|----------------------------|----------------------------|------------------------------|-----------------------------|--------|----------------|------------|-------------------|-------------|
|    | patient_id | ttn_type_cd | age_nm | time_dx_to_surgery_nm | time_dx_to_radiotherapy_nm | time_dx_to_chemotherapy_nm | time_dx_to_hormonotherapy_nm | time_dx_to_immunotherapy_nm | period | socecon_lvl_cd | country_cd | country_origin_cd | hospital_id |
| 1  | 1          | 1           | 59     | 21                    | NA                         | NA                         | NA                           | 4                           | 1      | 0              | ESP        | ESP               | 20          |
| 2  | 2          | 2           | 60     | 13                    | 15                         | NA                         | NA                           | 6                           | 21     | 0              | ESP        | ESP               | 27          |
| 3  | 3          | 2           | 54     | 53                    | 2                          | NA                         | NA                           | 104                         | 20     | 0              | ESP        | ESP               | 68          |
| 4  | 4          | 5           | 51     | 6                     | 3                          | NA                         | 3                            | 18                          | 8      | 0              | ESP        | ESP               | 98          |
| 5  | 5          | 3           | 72     | NA                    | NA                         | 1                          | NA                           | 33                          | 11     | 0              | ESP        | ESP               | 67          |
| 6  | 6          | 2           | 59     | 1                     | 0                          | NA                         | NA                           | 13                          | 17     | 0              | ESP        | ESP               | 89          |
| 7  | 7          | 4           | 52     | 1                     | NA                         | NA                         | 10                           | 21                          | 17     | 0              | ESP        | ESP               | 90          |
| 8  | 8          | 2           | 67     | 0                     | 17                         | NA                         | NA                           | 0                           | 10     | 0              | ESP        | ESP               | 45          |
| 9  | 9          | 5           | 51     | 28                    | 41                         | 0                          | NA                           | 2                           | 33     | 1              | ESP        | ESP               | 5           |
| 10 | 10         | 2           | 57     | 1                     | 53                         | NA                         | NA                           | 0                           | 11     | 0              | ESP        | ESP               | 88          |
| 11 | 11         | 5           | 58     | 53                    | 16                         | 7                          | NA                           | 96                          | 19     | 0              | ESP        | ESP               | 68          |
| 12 | 12         | 4           | 49     | 4                     | NA                         | NA                         | 10                           | 15                          | 22     | 0              | ESP        | ESP               | 57          |
| 13 | 13         | 4           | 36     | 20                    | NA                         | NA                         | 6                            | 3                           | 12     | 0              | ESP        | ESP               | 16          |
| 14 | 14         | 1           | 52     | 19                    | NA                         | NA                         | NA                           | 8                           | 7      | 0              | ESP        | ESP               | 17          |
| 15 | 15         | 4           | 64     | 0                     | NA                         | NA                         | 1                            | 13                          | 22     | 0              | ESP        | ESP               | 13          |
| 16 | 16         | 4           | 46     | 116                   | NA                         | NA                         | 107                          | 61                          | 27     | 0              | ESP        | ESP               | 75          |
| 17 | 17         | 1           | 65     | 3                     | NA                         | NA                         | NA                           | 7                           | 5      | 0              | ESP        | ESP               | 80          |
| 18 | 18         | 5           | 50     | 5                     | 2                          | 4                          | NA                           | 12                          | 14     | 0              | ESP        | ESP               | 54          |
| 19 | 19         | 4           | 42     | 10                    | NA                         | NA                         | 4                            | 52                          | 29     | 0              | ESP        | ESP               | 40          |
| 20 | 20         | 5           | 68     | 32                    | 2                          | 93                         | NA                           | 0                           | 2      | 0              | ESP        | ESP               | 33          |
| 21 | 21         | 2           | 51     | 0                     | 14                         | NA                         | NA                           | 0                           | 31     | 0              | ESP        | ESP               | 39          |
| 22 | 22         | 3           | 54     | NA                    | NA                         | 14                         | NA                           | 0                           | 21     | 0              | ESP        | ESP               | 94          |
| 23 | 23         | 3           | 44     | NA                    | NA                         | 37                         | NA                           | 4                           | 22     | 1              | ESP        | ESP               | 12          |
| 24 | 24         | 4           | 61     | 76                    | NA                         | NA                         | 222                          | 33                          | 31     | 0              | ESP        | ESP               | 16          |
| 25 | 25         | 4           | 71     | 0                     | NA                         | NA                         | 0                            | 6                           | 9      | 1              | ESP        | ESP               | 51          |
| 26 | 26         | 2           | 70     | 2                     | 0                          | NA                         | NA                           | 15                          | 20     | 0              | ESP        | ESP               | 3           |
| 27 | 27         | 1           | 67     | 38                    | NA                         | NA                         | NA                           | 35                          | 32     | 0              | ESP        | ESP               | 90          |
| 28 | 28         | 5           | 56     | 81                    | 319                        | 9                          | NA                           | 81                          | 20     | 0              | ESP        | ESP               | 69          |
| 29 | 29         | 4           | 58     | 4                     | NA                         | NA                         | 5                            | 37                          | 6      | 0              | ESP        | ESP               | 50          |
| 30 | 30         | 1           | 52     | 91                    | NA                         | NA                         | NA                           | 178                         | 1      | 0              | ESP        | ESP               | 41          |
| 31 | 31         | 5           | 57     | 0                     | 1                          | 0                          | NA                           | 1                           | 10     | 0              | ESP        | ESP               | 38          |
| 32 | 32         | 3           | 57     | NA                    | NA                         | 0                          | NA                           | 2                           | 21     | 0              | ESP        | ESP               | 92          |
| 33 | 33         | 1           | 47     | 92                    | NA                         | NA                         | NA                           | 0                           | 10     | 0              | ESP        | ESP               | 89          |
| 34 | 34         | 2           | 75     | 12                    | 30                         | NA                         | NA                           | 7                           | 12     | 0              | ESP        | ESP               | 42          |
| 35 | 35         | 3           | 55     | NA                    | NA                         | 9                          | NA                           | 2                           | 20     | 0              | ESP        | ESP               | 75          |
| 36 | 36         | 5           | 43     | 38                    | 72                         | 22                         | NA                           | 6                           | 18     | 0              | ESP        | ESP               | 67          |
| 37 | 37         | 2           | 44     | 76                    | 59                         | NA                         | NA                           | 0                           | 29     | 0              | ESP        | ESP               | 66          |
| 38 | 38         | 2           | 55     | 11                    | 15                         | NA                         | NA                           | 0                           | 20     | 0              | ESP        | ESP               | 87          |
| 39 | 38         | 2           | 55     | 11                    | 15                         | NA                         | NA                           | 0                           | 20     | 0              | ESP        | ESP               | 87          |



# Data quality assessment

PHIRI Federated Analysis Application (Docker)

Common Data Model

Synthetic dataset

Quality Analysis (scripts)

Analysis (scripts)

Outputs recollection & synthesis

PHIRI delayed\_ttm\_breast\_cancer

Using Python's Pandas Profiling API

## Overview

Overview Warnings 13 Reproduction

### Dataset statistics

|                               |         |
|-------------------------------|---------|
| Number of variables           | 13      |
| Number of observations        | 19356   |
| Missing cells                 | 42583   |
| Missing cells (%)             | 16.9%   |
| Total size in memory          | 3.8 MiB |
| Average record size in memory | 208.0 B |

Overview Warnings 13 Reproduction

### Warnings

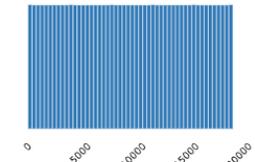
|   |          |
|---|----------|
| country_cd has constant value "ESP"                           | Constant |
| country_origin_cd has constant value "ESP"                    | Constant |
| time_dx_to_surgery_nm has 3909 (20.2%) missing values         | Missing  |
| time_dx_to_radiotherapy_nm has 11585 (59.9%) missing values   | Missing  |
| time_dx_to_chemotherapy_nm has 11558 (59.7%) missing values   | Missing  |
| time_dx_to_hormonotherapy_nm has 15531 (80.2%) missing values | Missing  |
| patient_id has unique values                                  | Unique   |
| time_dx_to_surgery_nm has 1960 (10.1%) zeros                  | Zeros    |
| time_dx_to_radiotherapy_nm has 1003 (5.2%) zeros              | Zeros    |
| time_dx_to_chemotherapy_nm has 1653 (8.5%) zeros              | Zeros    |
| time_dx_to_hormonotherapy_nm has 656 (3.4%) zeros             | Zeros    |
| time_dx_to_immunotherapy_nm has 3063 (15.9%) zeros            | Zeros    |
| socecon_lv1_cd has 17421 (90.0%) zeros                        | Zeros    |

## Variables

patient\_id  
Real number (ℝ<sub>≥0</sub>)

UNIQUE

|              |        |              |       |
|--------------|--------|--------------|-------|
| Distinct     | 19356  | Minimum      | 1     |
| Distinct (%) | 100.0% | Maximum      | 19356 |
| Missing      | 0      | Zeros        | 0     |
| Missing (%)  | 0.0%   | Zeros (%)    | 0.0%  |
| Infinite     | 0      | Negative     | 0     |
| Infinite (%) | 0.0%   | Negative (%) | 0.0%  |



# Analytical workflows

PHIRI Federated Analysis Application (Docker)

Common Data Model

Synthetic dataset

Quality Analysis (scripts)

Analysis (scripts)

Outputs recollection & synthesis

```
Run Chunk | Run Above
16 ```{r load_libraries}
17 ## 3. Load required libraries ####
18 library(DBI)
19 library(dplyr)
20 library(htmlTable)
21 library(magrittr)
22 library(utis)
23 library(tidyverse)
24 library(kableExtra)
25 library(wrapr)
26 library(plyr)
27
28
29 ```
30
31
32 Run Chunk | Run Above
33 ```{r load_data}
34 con <- dbConnect(RSQLite::SQLite(), "/home/phiri/analysis-scripts/inputs/database/database.db")
35 df <- dbReadTable(con, "perinatal_health")
36
37
38
39 Run Chunk | Run Above
40 ```{r indicators}
41 indicator_names <- c()
42 n_per_year22<-df %>% filter(GA >= 22, VITAL != 4, VITAL!= 1, VITAL !=99) %>% group_by(year) %>% tally()
43 total_per_year22 <- df %>% filter(GA >= 22) %>% group_by(year) %>% tally()
44 n_per_year22$indicator <- "aa_22weeks"
45
46 n_per_year24<-df %>% filter(GA >= 24, VITAL != 4, VITAL!= 1, VITAL !=99) %>% group_by(year) %>% tally()
47 total_per_year24 <- df %>% filter(GA >= 24) %>% group_by(year) %>% tally()
48 n_per_year24$indicator <- "ab_24weeks"
49
50 n_per_year28<-df %>% filter(GA >= 28, VITAL != 4, VITAL!= 1, VITAL !=99) %>% group_by(year) %>% tally()
51 total_per_year28 <- df %>% filter(GA >= 28) %>% group_by(year) %>% tally()
52 n_per_year28$indicator <- "ac_28weeks"
```



# Containerised solution ready for deployment

PHIRI Federated Analysis Application (Docker)

Common Data Model

Synthetic dataset

Quality Analysis (scripts)

Analysis (scripts)

Use Case Deployment

**PHIRI**  
Population Health Information  
Research Infrastructure

**USE CASE A**  
**Vulnerable populations**  
Has the COVID-19 pandemic changed existing patterns of non-COVID-19 health care utilisation and mortality for vulnerable populations within and between countries?  
[CHECK THE DATA MODEL HERE!](#)

**USE CASE B**  
**Delayed treatment in breast cancer**  
Has there been any increase in surgical and/or co-adjuvant (i.e. radiotherapy, chemotherapy, immunotherapy) treatments delay in eligible women diagnosed of breast cancer, as a consequence of the COVID-19 crisis?  
[CHECK THE DATA MODEL HERE!](#)

**USE CASE C**  
**Perinatal health**  
Focus on the indirect effects of the COVID-19 pandemic on maternal and newborn health with a focus on potential inequalities regarding non-deferrable healthcare needs and risks of adverse perinatal outcomes due to stress and social deprivation.  
[CHECK THE DATA MODEL HERE!](#)

**USE CASE D**  
**Mental health**  
Has there been any increase in individuals with mental health risk factors or mental disease, as a consequence of the COVID-19 crisis? This case study will measure changes in population mental health and healthcare utilisation associated with the COVID-19 pandemic.  
[CHECK THE DATA MODEL HERE!](#)

**Application**

**Data mapping**  
1) Select the Use Case you want to participate in and introduce your data for analysis. Data should be extracted from your health information systems following the requirements and specifications of the data model of the use

**General analysis**  
2) Select the Use Case you want to participate in and launch the analysis provided by the Use Case coordinators. Analysis scripts are open source and can be audited by anyone.

**docker**



# Running local analyses and results devolution

PHIRI Federated Analysis Application (Docker)

Common Data Model

Synthetic dataset

Quality Analysis (scripts)

Analysis (scripts)

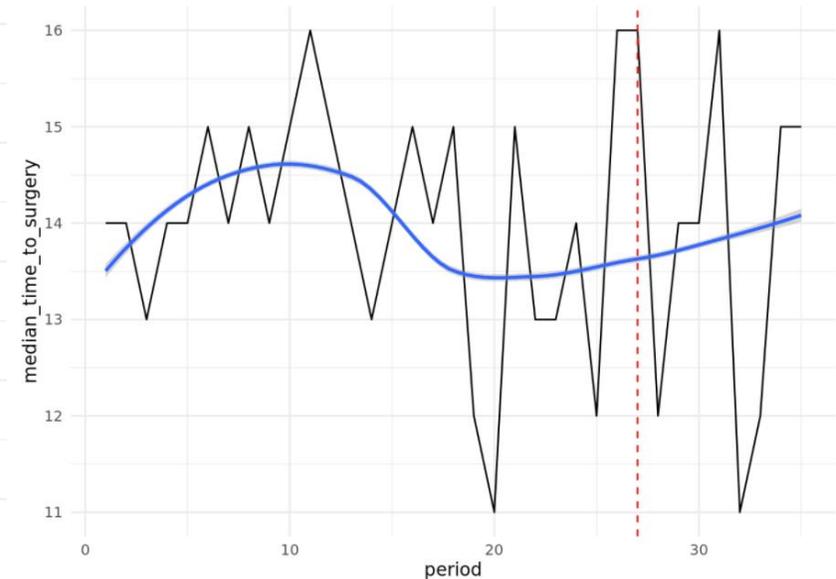
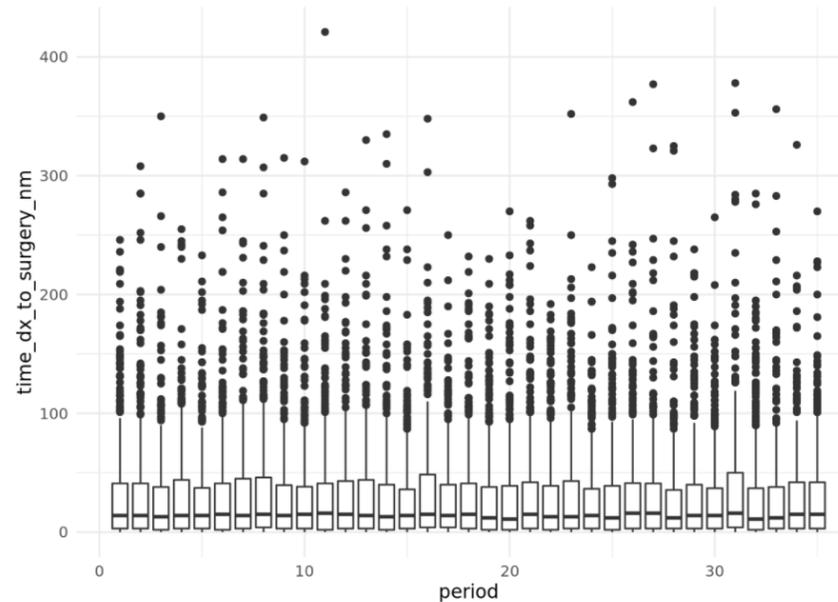
Outputs recollection & synthesis

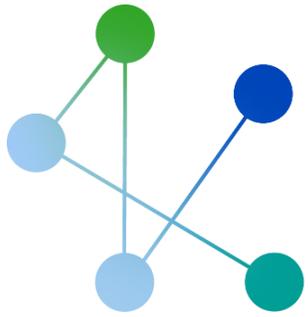
## Use Case B report example with synthetic data

Estupiñán-Romero, Francisco; González-Galindo, Javier; Bernal-Delgado, Enrique  
16/6/2021

### Exploratory Analysis (Local)

Distribution of times from diagnosis of breast cancer to treatment





# PHIRI

Population Health Information  
Research Infrastructure

## Thank you for your attention

Enrique Bernal-Delgado, IACS, ES

Martin Thissen, RKI, DE

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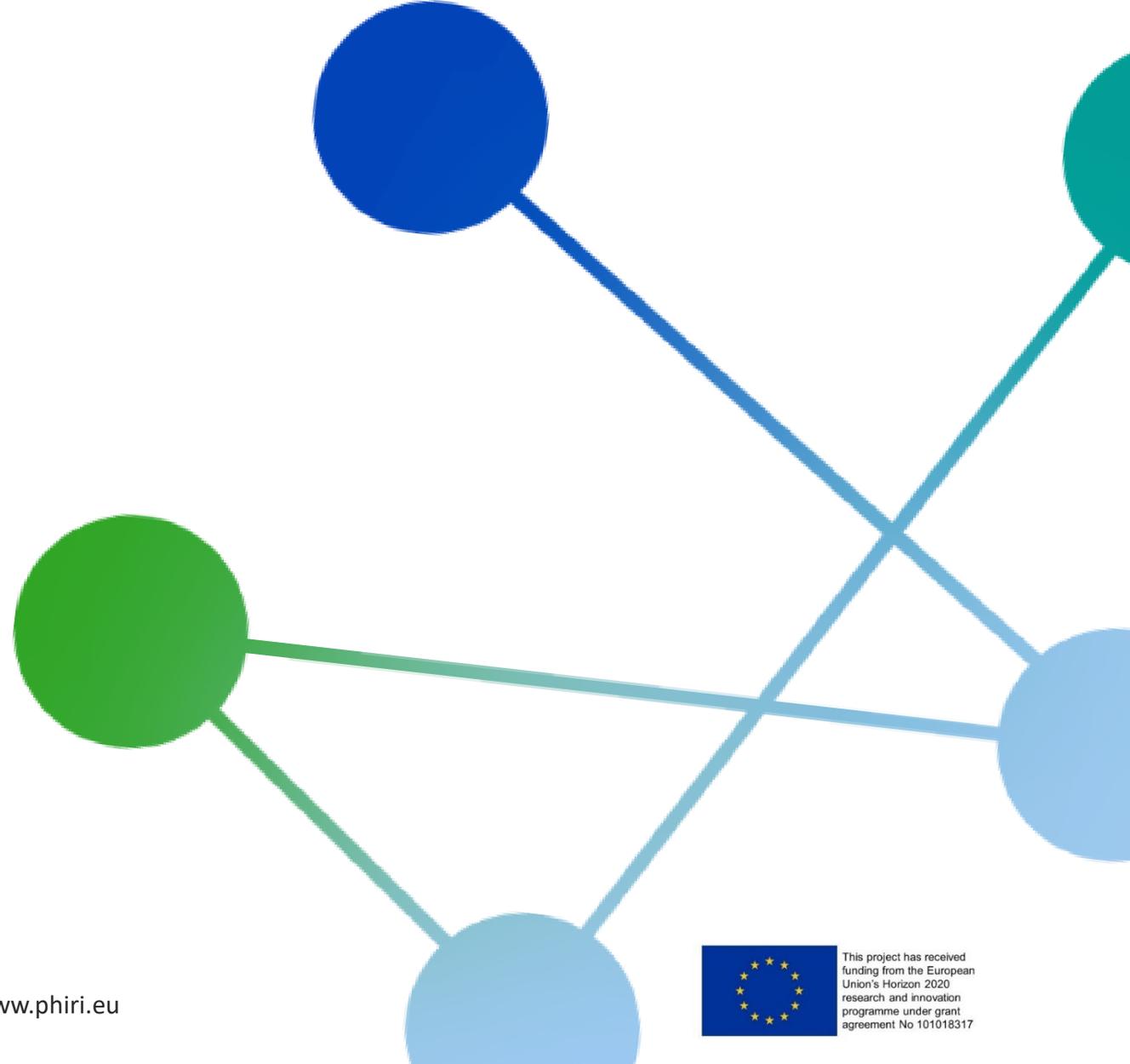


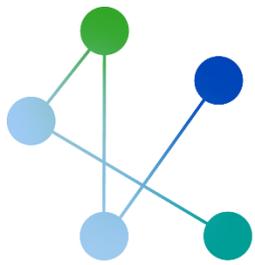
**Instituto Aragonés de  
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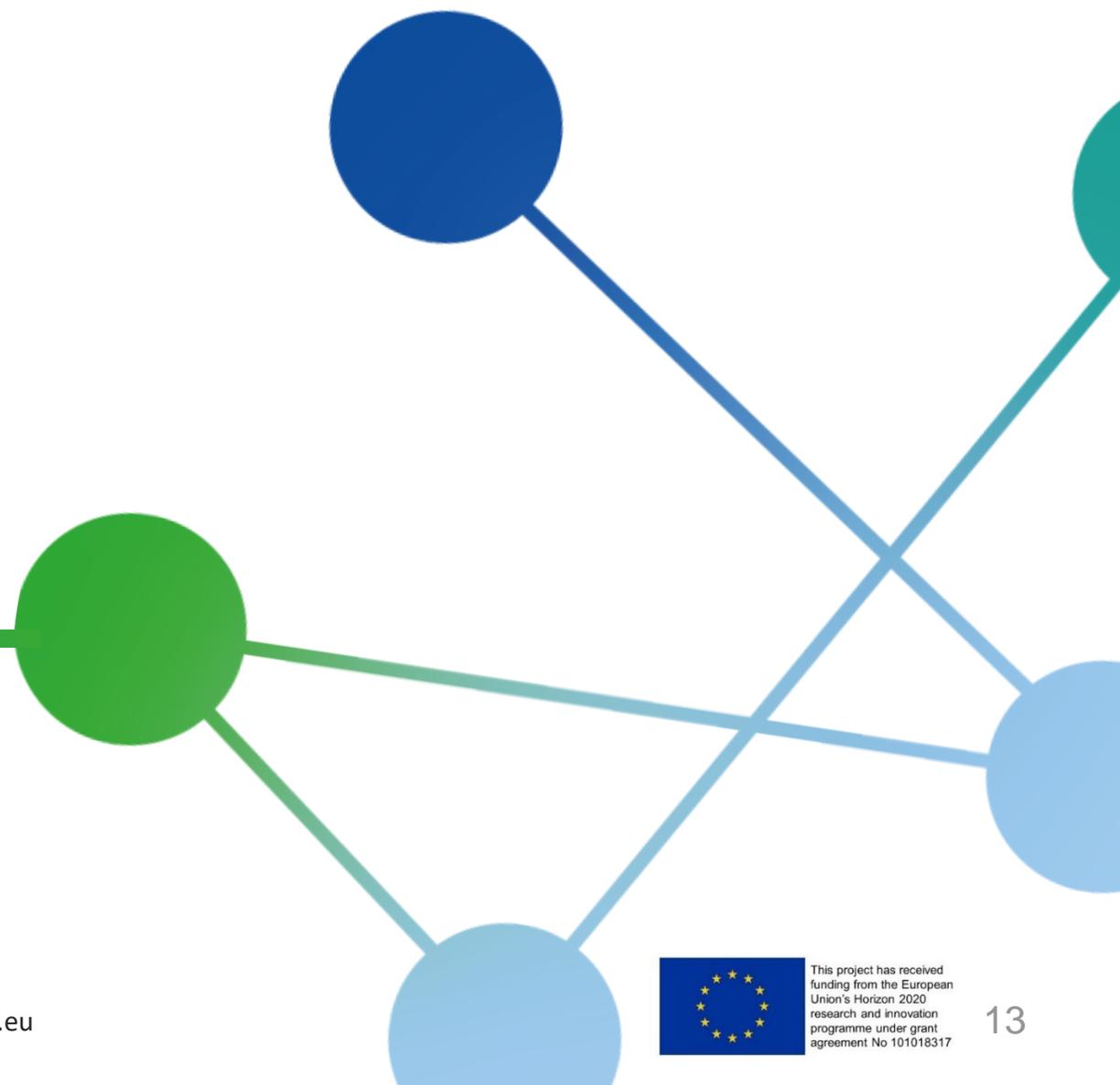


# PHIRI

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Research Infrastructure

## Use Cases measuring the impact of COVID-19 on population health

17<sup>th</sup> World Congress on Public Health – A World in Turmoil  
Opportunities to Focus on the Public's Health



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# PHIRI – Outcomes & Services



**BUILDING A FEDERATED RESEARCH INFRASTRUCTURE WITH USE CASES**



**HEALTH INFORMATION PORTAL**



**HEALTH INFORMATION TOOLS AND GUIDELINES**



**EUROPEAN SCHOOL ON HEALTH INFORMATION**



- ❖ Data sources and publications
- ❖ International guidelines, initiatives and projects
- ❖ Training material and courses
- ❖ Ethical and legal tools

- ❖ Bi-weekly COVID-19 expertise exchange
- ❖ Research methodologies to assess the impact of Covid-19
- ❖ Foresight: modelling and scenarios

- ❖ Foresight methodologies to assess the wider impact of COVID-19
- ❖ Infodemic management training
- ❖ Data hubs developer training



# Research Use Cases on COVID-19 – Objectives

4 real life research use cases measuring the impact of COVID-19 on population health



Direct and indirect determinants of COVID-19 infection and outcomes in vulnerable population groups with reference to inequalities



COVID-19 related delayed care in breast cancer patients



The impact of COVID-19 on perinatal health and perinatal health inequalities



COVID-19 related changes in population mental health

**Demonstrate** how a broad variety of data (e.g. administrative and survey data) can be reused in a distributed way across Europe:

- a) **Conduct research** through use cases of immediate relevance on the consequences of the COVID-19 pandemic on European population health
- b) **Pilot activities** for the benefits and added value of a federated research infrastructure by bringing together data from different European countries

# Research Use Cases on COVID-19 – Achievements

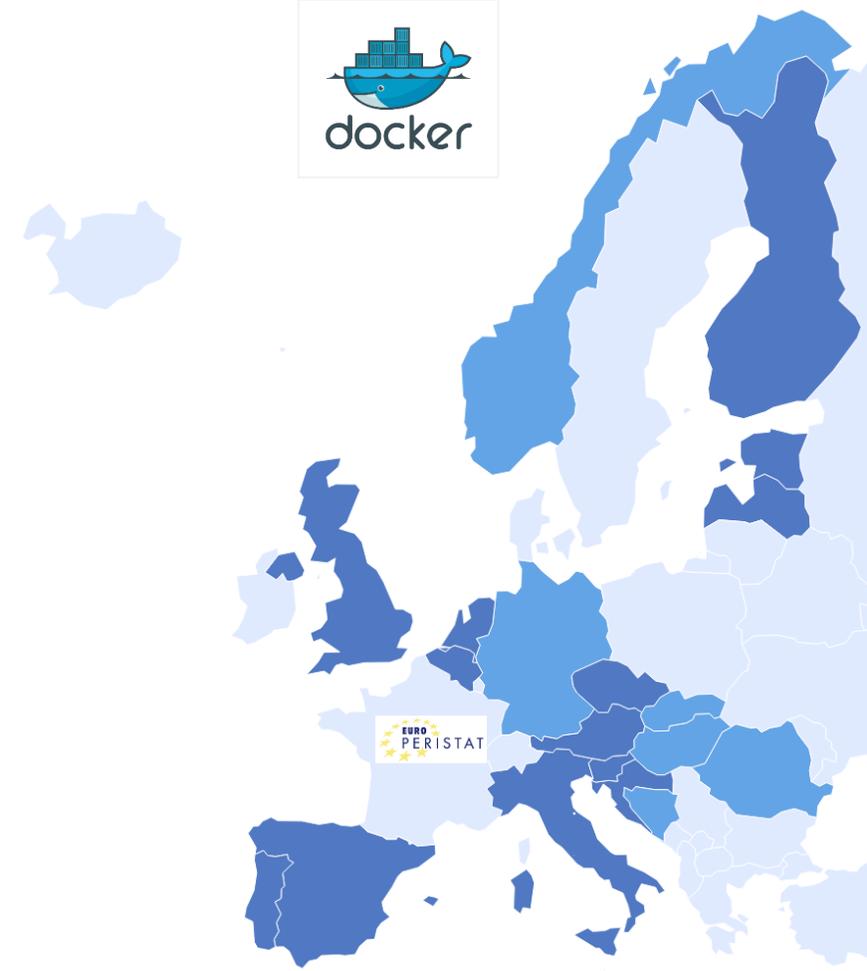
→ In **almost 20 data hubs**, data is mobilized and ready to be analyzed in a distributed manner



# Research Use Cases on COVID-19 – Achievements

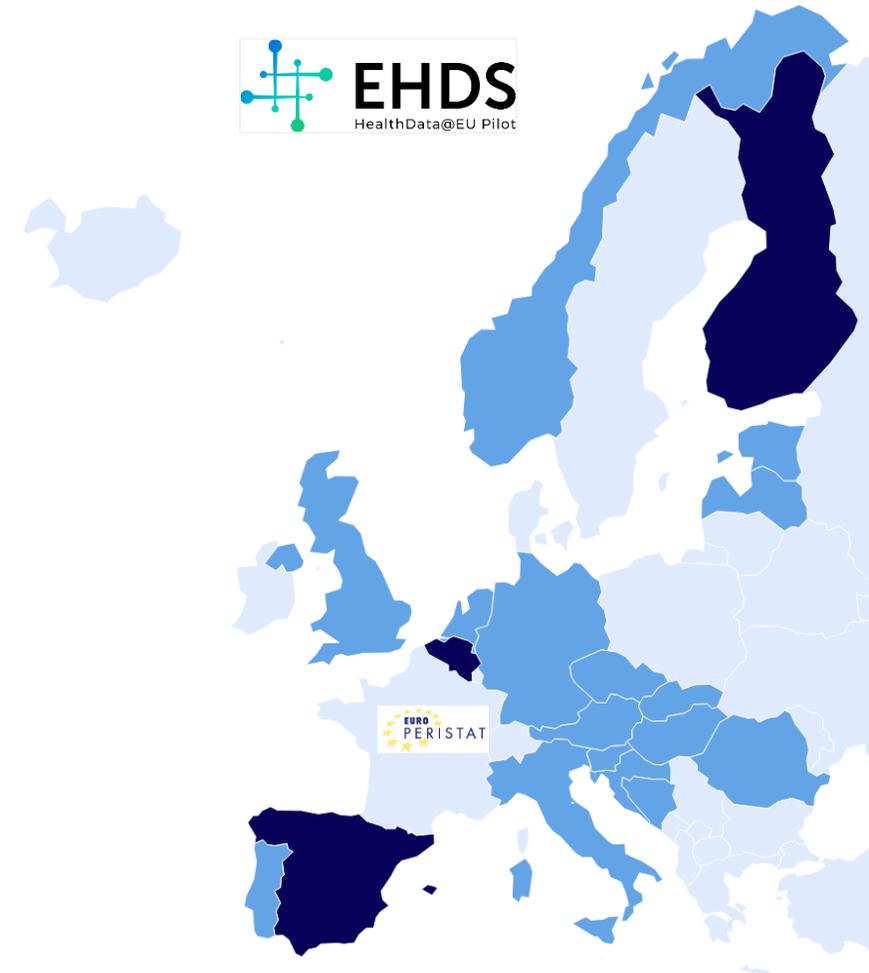
- In almost 20 data hubs, data is mobilized and ready to be analyzed in a distributed manner
- In 13 data hubs, the PHIRI-app Docker is already deployed and tested\*

\***BUT** there are some other countries or institutions that have also downloaded and deployed the Docker that we know of outside of the PHIRI project



# Research Use Cases on COVID-19 – Achievements

- In almost 20 data hubs, data is mobilized and ready to be analyzed in a distributed manner
- In 13 data hubs, the PHIRI-app Docker is already deployed and tested
- There is already **overlap** between the PHIRI data hubs and the **health data access bodies (HDAB)** in the EHDS2
  - Majority of PHIRI use cases data hubs will be HDAB in the future



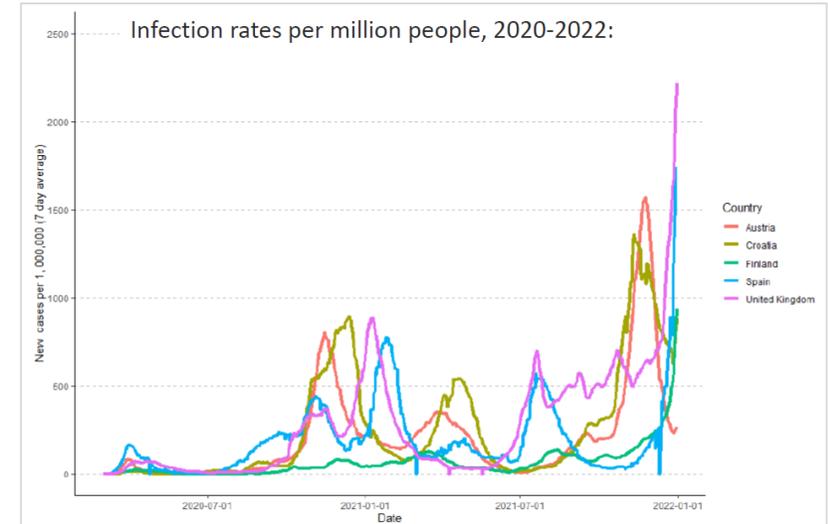
# Research Use Cases on COVID-19 – Results



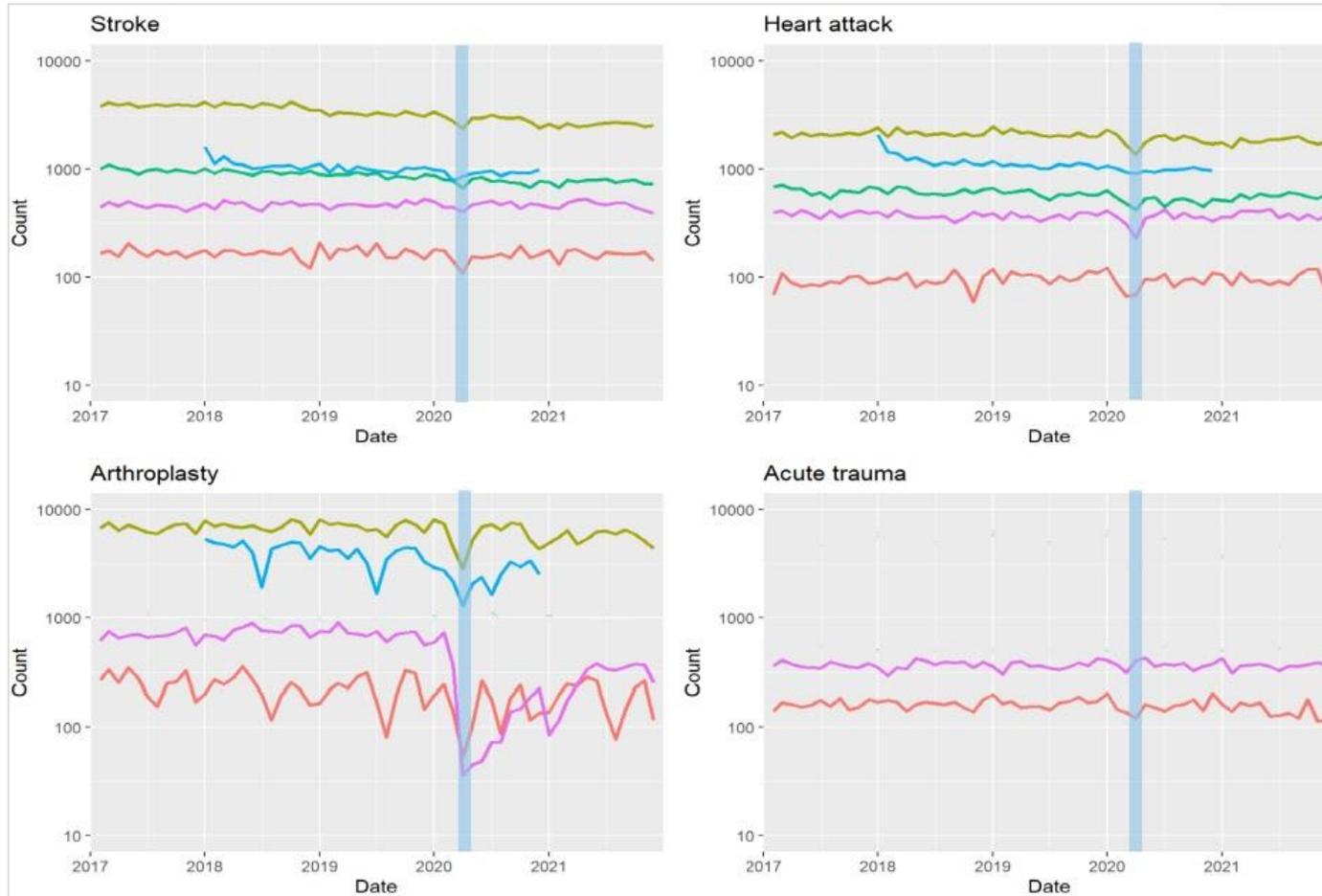
Has the COVID19 pandemic changed existing patterns of non-COVID-19 health care utilisation for (vulnerable) populations within and between countries?

- Heart attack and strokes (Cohort 1)
- Hip and knee replacements (Cohort 2)
- Serious trauma admissions (Cohort 3)

|          | Associated entity in ERD | Label (var_label)     | Name (var_concept)                       | Classification/Encoding        | Units       | Format                                  | Description                               |
|----------|--------------------------|-----------------------|--|--------------------------------|-------------|---|---|
| basics   | patient                  | patient_id            | patient identifier                       | private key ciphering function | none        | string                                  | patient pseudonymized identifier          |
|          | patient                  | sex                   | sex                                      |                                |             |   |   |
|          | patient                  | age_nm                | age                                      | none                           | years       | integer                                 | patient's age as of 2019-01-01            |
|          | observation period       | period                | [time period]                            | none                           | month       | integer                                 | natural month                             |
| cohort 1 | heart event              | acute_event_heart     | major vascular event - heart attack      | ICD10:I21                      |             |   |   |
|          | date heart event         | date_event_heart      | date - heart attack                      | date                           | date_DMY_nr | YYYY-mm-dd                              |   |
|          | stroke event             | acute_event_stroke    | major vascular event - stroke            | I60-I64                        |             |   |   |
|          | date stroke event        | date_event_stroke     | date - stroke                            |                                | date_DMY_nr | YYYY-mm-dd                              |   |
| cohort 2 | procedure                | ttm_type_cd           | type of treatment                        | types of treatment referred    | none        | integer                                 | type of treatment received by the patient |
|          | procedure                | surgery_elective_hip  | elective surgery, hip joint replacement  | OPCS codes in UK W37-W39       |             |   |   |
|          | procedure                | surgery_elective_knee | elective surgery, knee joint replacement | OPCS codes in UK W40-W42       |             |   |   |
| cohort 3 | condition                | acute_event_trauma    | hospital admission for trauma based on   | ICD10: S720, S721, S722, S723, | none        | string                                  | Based on scientific analysis by New       |
|          | Date of event            | date_event            | date of admission                        | date                           | date_DMY_nr | YYYY-mm-dd                              | date of admission                         |
| optional | Optional:                |                       |  |                                |             |   |   |
|          | patient                  | educ_cd               | highest completed education level        | quintile or top/bottom         | quintiles   | integer                                 | patient's highest completed education     |
|          | patient                  | socecon_lvl_cd        | socioeconomic level                      | quintile or top/bottom         | quintiles   | integer                                 | patient's socioeconomic level (quintile)  |
|          | patient                  | country_cd            | country (residence)                      | ISO3166                        | none        | string                                  | patient's country of residence            |
|          | patient                  | district_cd           | district (residence)                     | e.g. Eurostat NUTS             | none        | string                                  |   |
| patient  | country_origin_cd        | country (origin)      | ISO3166                                  | none                           | string      | patients' country of origin (country of |   |



# Research Use Cases on COVID-19 – Results



Raw event counts



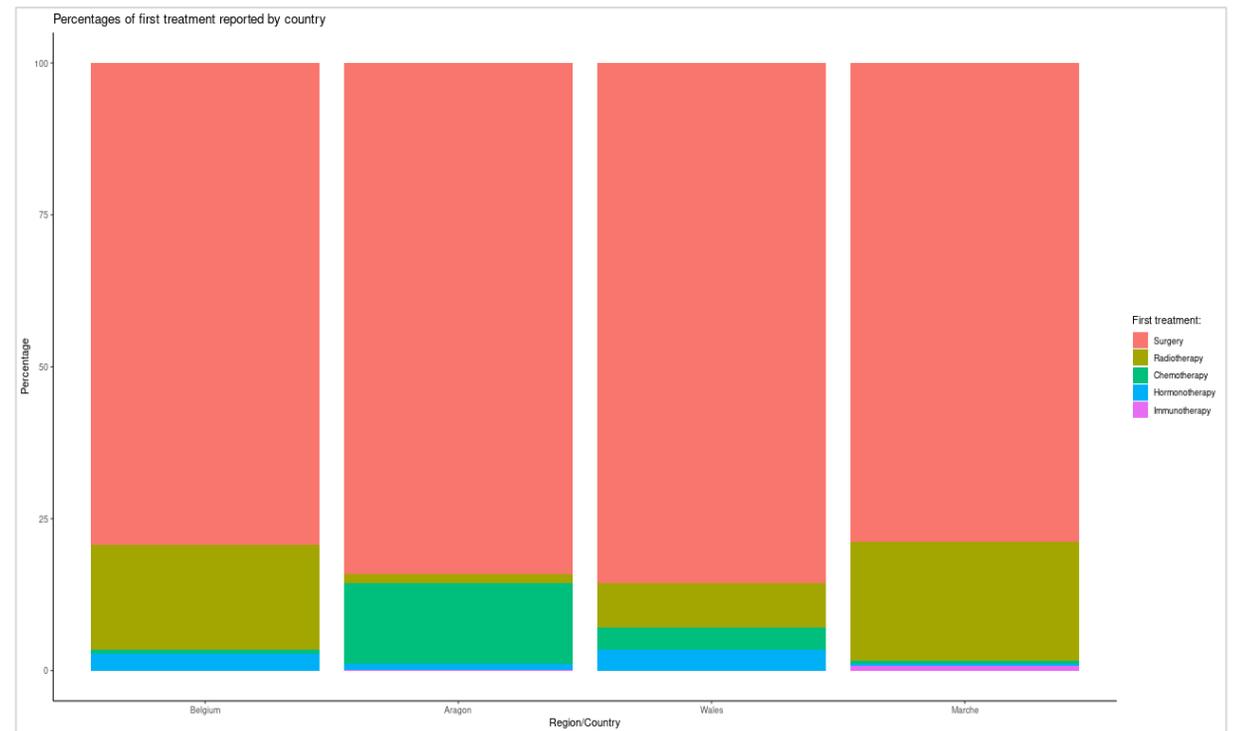
# Research Use Cases on COVID-19 – Results



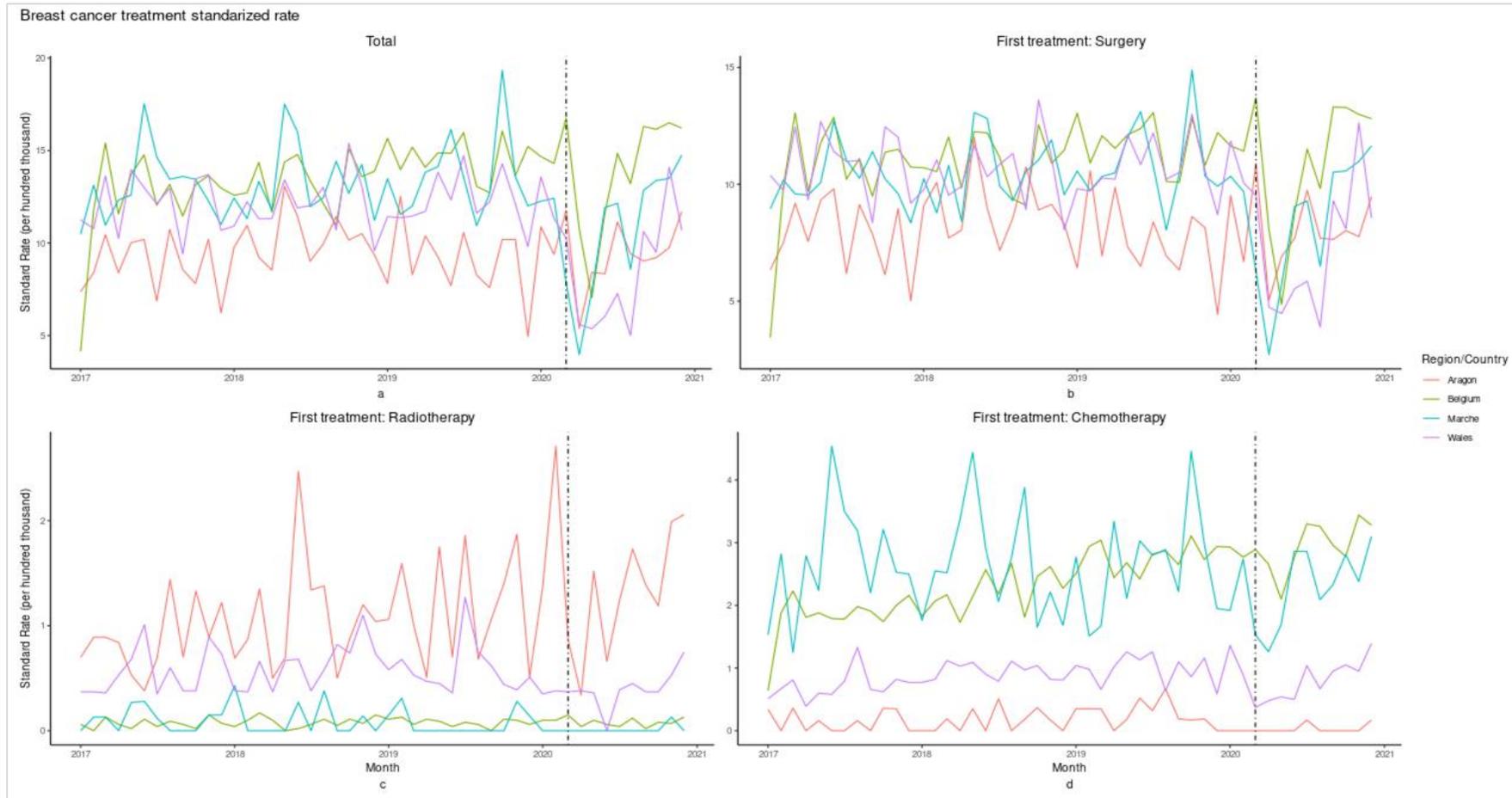
Was there any delay in the treatment of breast cancer patients associated with the COVID-19 pandemic?

**Data hubs participation: N = 4**

Aragon (AR, Spain), Wales (WA, United Kingdom),  
Belgium (BE), Marche (MA, Italy)



# Research Use Cases on COVID-19 – Results



# Research Use Cases on COVID-19 – Results



Were population indicators of maternal and newborn health affected by the pandemic/lockdown?

## Stillbirth (baby born without signs of life)

- 3-4 per 1000 births (15-18,000 babies per year in Europe)
- High health and psychological burden for parents, costs for families and society

## Preterm birth (birth before 37 weeks of gestation)

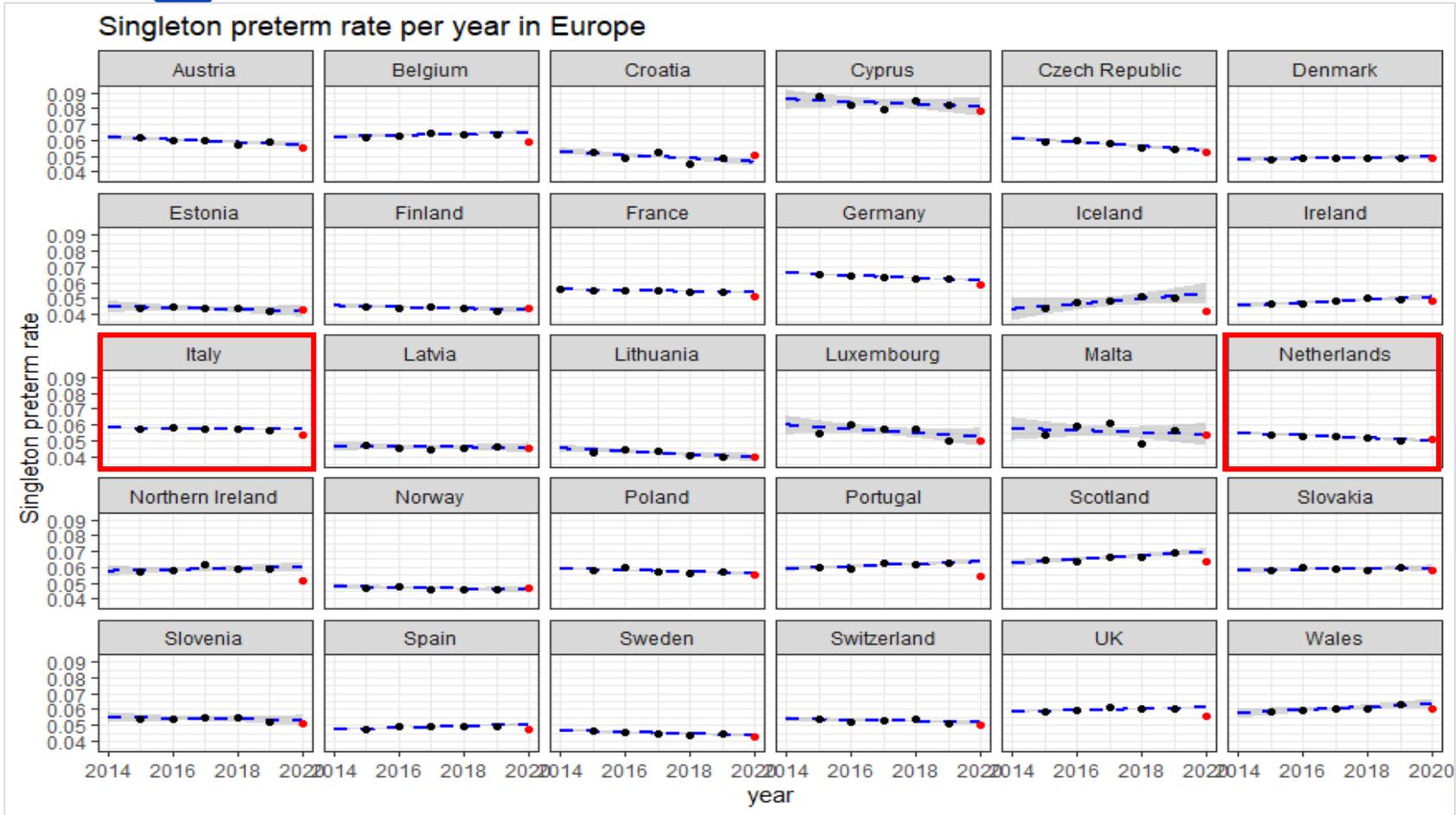
- Affects about 350,000 births per year in Europe, few effective prevention strategies
- Principal cause of infant death
- Long-term neurodevelopment impairment and other health problems among survivors

Implementation of PHIRI protocol

- Implemented successfully protocol
- Not yet implemented protocol



# Research Use Cases on COVID-19 – Results



**Pooled estimate**  
 RR=0.96 (0.96 to 0.98) = 4% decrease in preterm birth

**High heterogeneity**  
 $I^2 = 77.5%$  (proportion of total variation in effect estimate due to between-study heterogeneity)

**Range of effects** = 10% decrease in preterm birth to moderate increase of 3 to 4%.

Countries with stronger effects: Portugal – Belgium – UK – Spain – Italy – France

Countries with no effects: Nordic and Baltic countries, Netherlands



# Research Use Cases on COVID-19 – Results

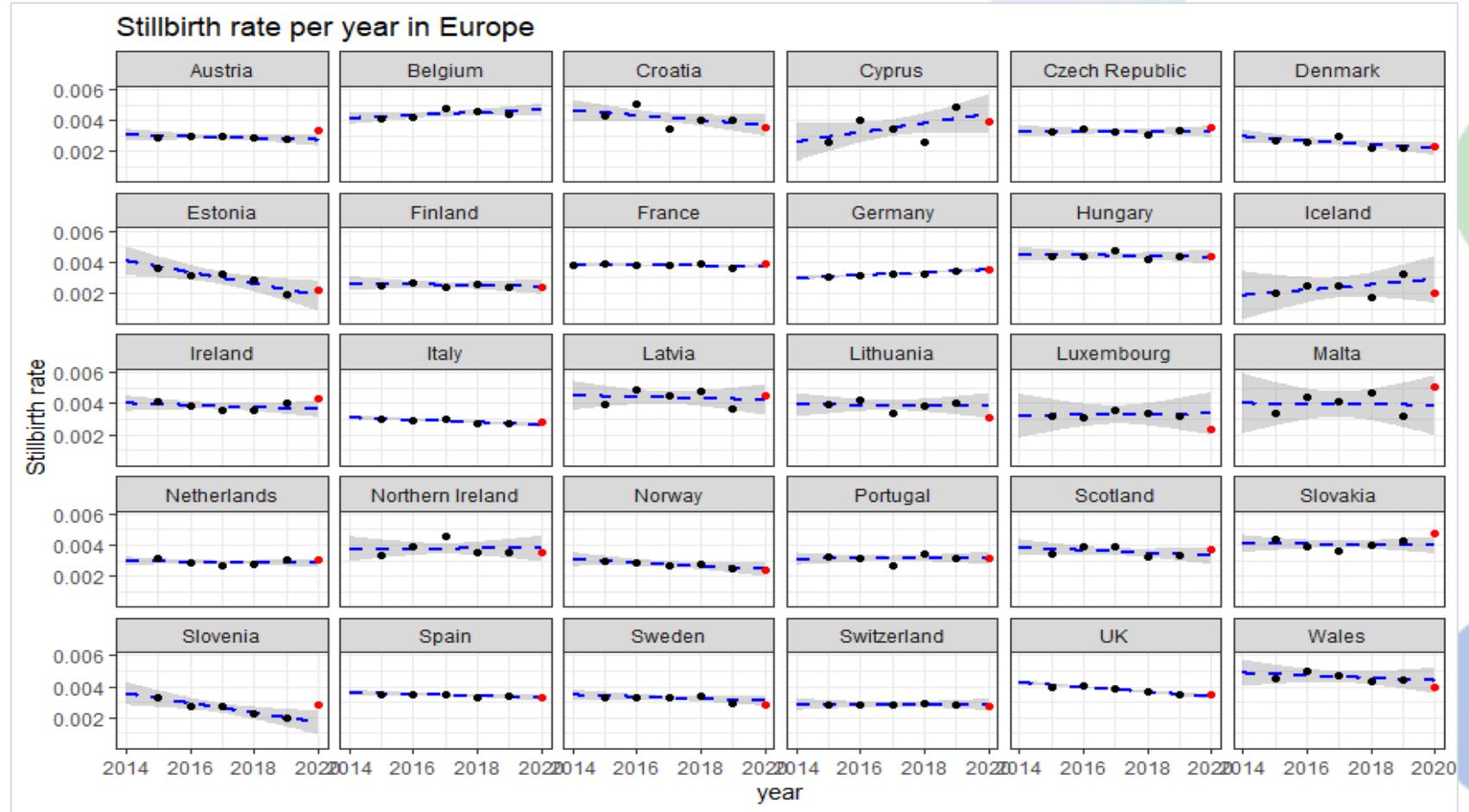
## Estimate of pooled effect

RR=1.05 (1.02 to 1.08) = 5% increase in stillbirth

## Lower heterogeneity

$I^2 = 20.3\%$  (proportion of total variation in effect estimate due to between-study heterogeneity)

Range of effects = No decreases significant / Austria higher stillbirth rates



# Research Use Cases on COVID-19 – Results



Has the mental health status (depression/anxiety) of the general population changed during the COVID-19 pandemic?

Table 3: Proportion of respondents reporting having negative feelings by age and gender, EU27 (%)

|       |             | Summer 2020 |        |           | Spring 2021 |        |           |
|-------|-------------|-------------|--------|-----------|-------------|--------|-----------|
|       |             | Tense       | Lonely | Depressed | Tense       | Lonely | Depressed |
| Men   | 18–34 years | 34          | 25     | 21        | 46          | 35     | 34        |
|       | 35–49 years | 30          | 21     | 19        | 41          | 31     | 32        |
|       | 50+ years   | 22          | 18     | 15        | 28          | 26     | 23        |
| Women | 18–34 years | 45          | 30     | 28        | 52          | 38     | 40        |
|       | 35–49 years | 38          | 22     | 27        | 49          | 34     | 39        |
|       | 50+ years   | 24          | 18     | 17        | 35          | 30     | 29        |

Notes: Green = lowest value, red = highest value. All differences between the two time periods are statistically significant. Any discrepancies between the figures in the text and table are due to rounding.

Results from 6 data hubs:

- Aragon (IACS)
- Austria
- Croatia
- Finland
- Romania
- Wales



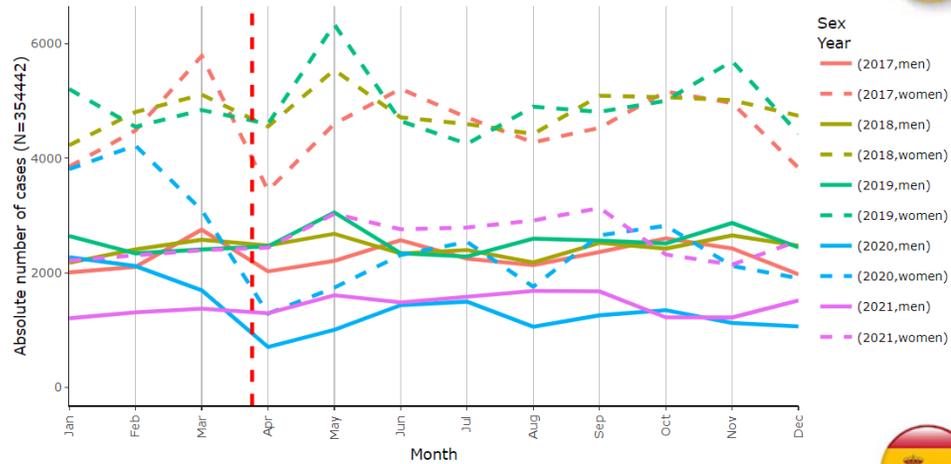
Source: Living, working and COVID-19 e-survey data. Mental health and trust decline across EU as pandemic enters another year. EuroFound, 2021.



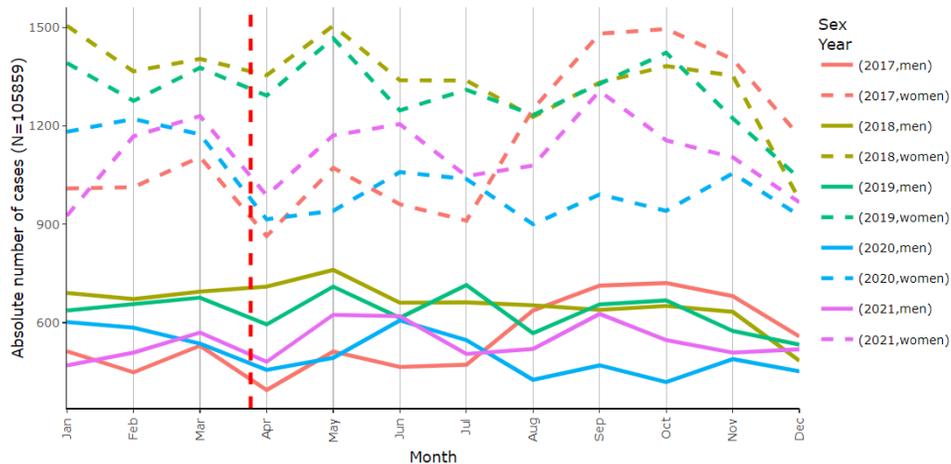
# Research Use Cases on COVID-19 – Results



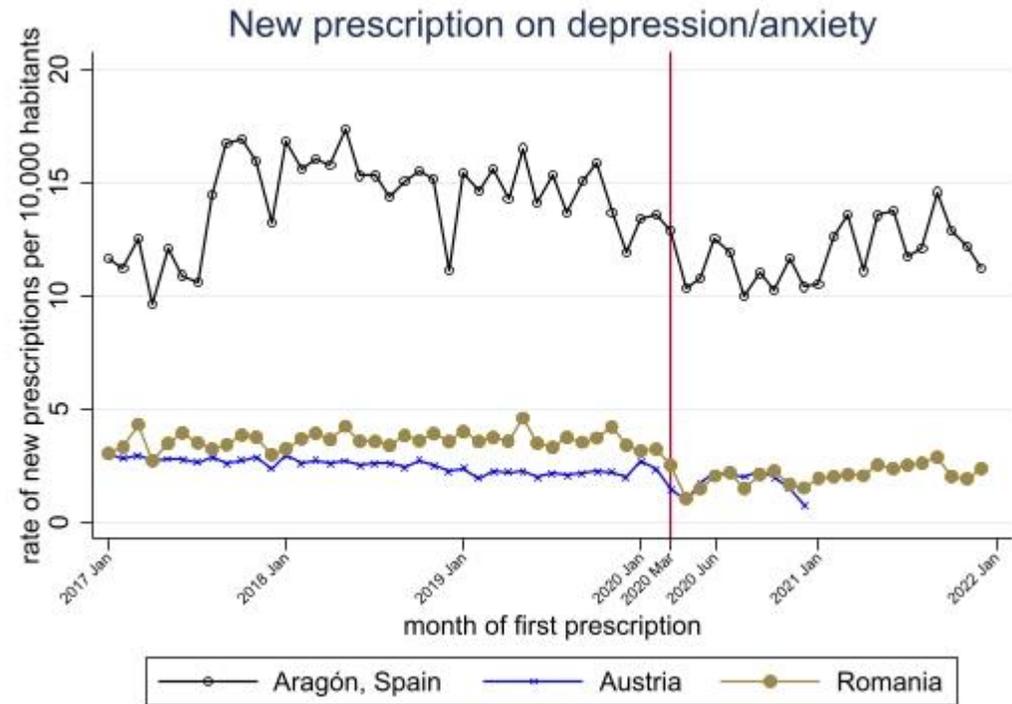
All events



All events



## Cross-country comparison: preliminary analysis of new prescriptions

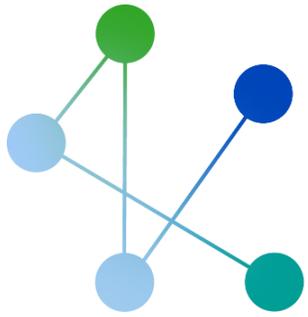


# Research Use Cases on COVID-19 – Implications

1. Facilitate research by making scalable, reproducible methods available
  2. Use Case outputs feed into the federated research infrastructure
    - Data models, analytical pipelines and reporting solutions published in a public open access repository (Zenodo) → live-demo to replicate the use cases (HIP)
  3. FAIRified use cases analysis results publication in the data portal
    - Aggregated data and metadata, for the development and the analysis results of the use cases
- 
1. Providing outcomes to guide policy makers in preparedness and response scenarios
  2. We will ensure the development of a format for the timely dissemination of use case results to the targeted groups, e.g. through scientific publications, fact sheets, policy briefs and via webinars, trainings etc.

## Target Groups





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## Thank you for your attention

Enrique Bernal-Delgado, IACS, ES  
Martin Thissen, RKI, DE  
Follow us on Twitter:  @PHIRI4EU

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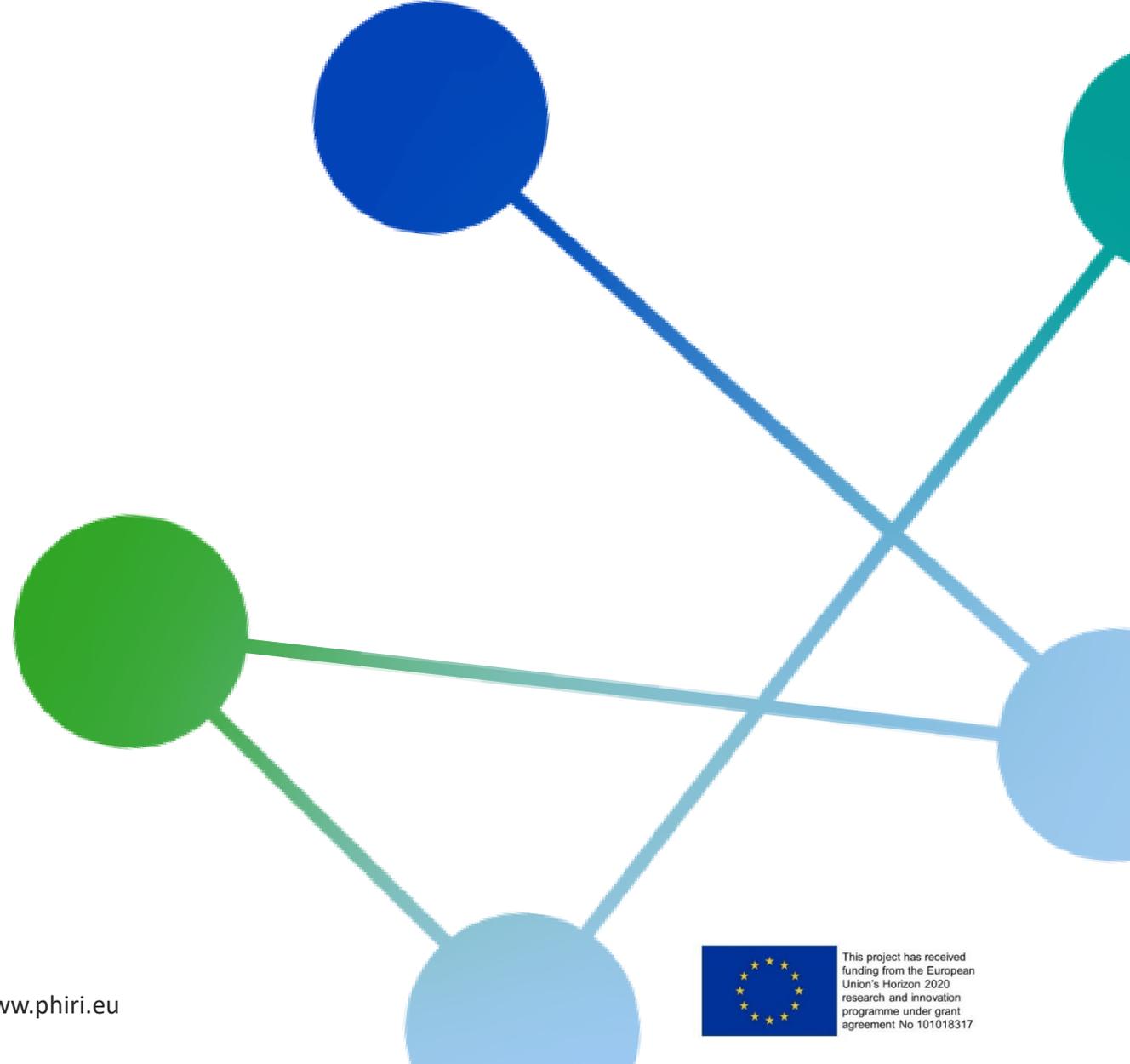


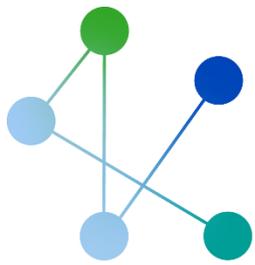
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This project has received  
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Union's Horizon 2020  
research and innovation  
programme under grant  
agreement No 101018317





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# PHIRI FRI steps towards Federated Learning

17<sup>th</sup> World Congress on Public Health – A World in Turmoil  
Opportunities to Focus on the Public's Health

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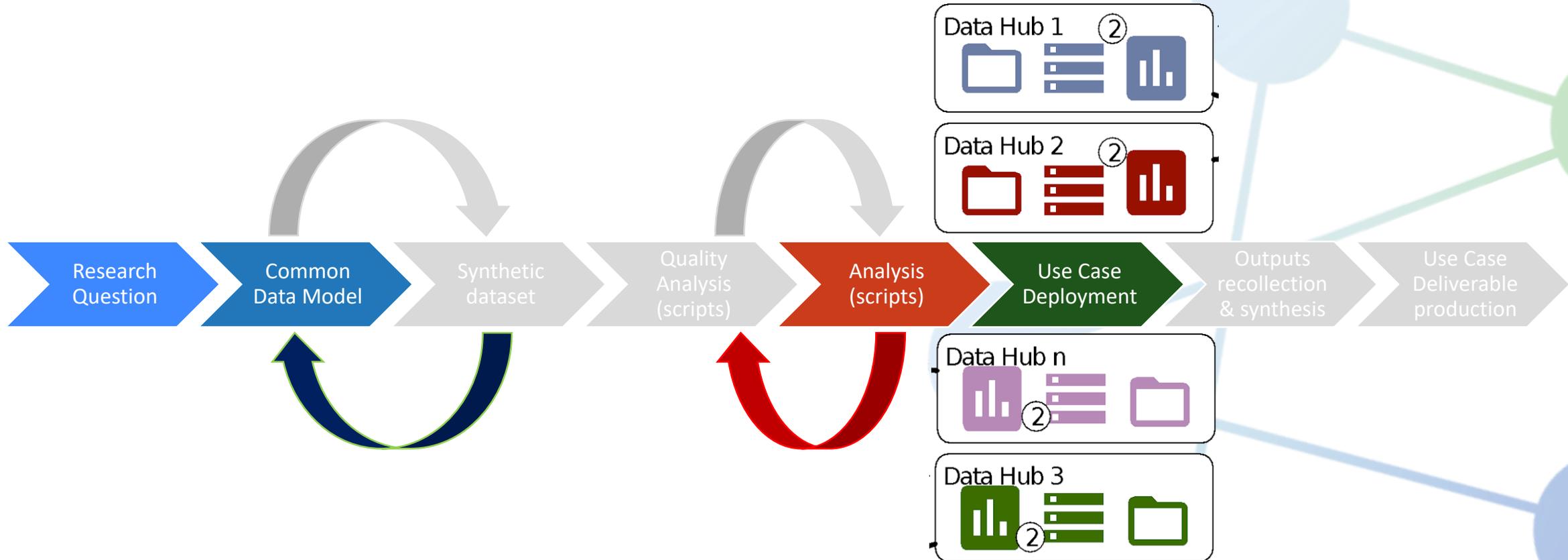
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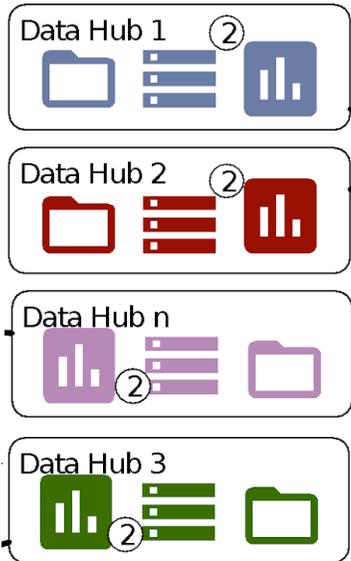
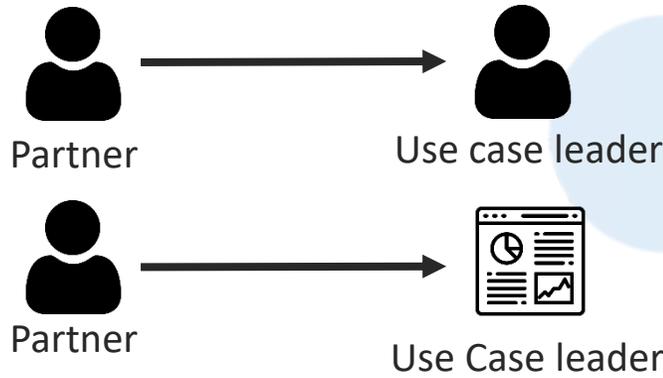


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# PHIRI workflow (*Data hub's perspective*)

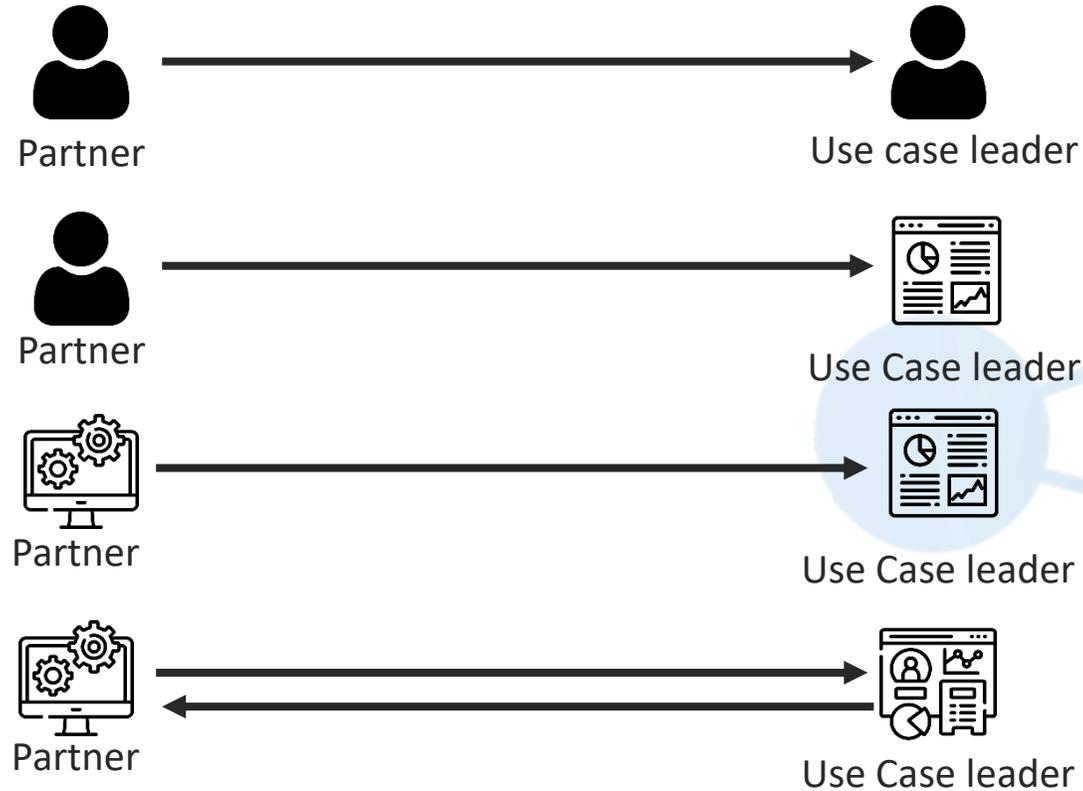


# PHIRI workflow (Data hub's perspective)

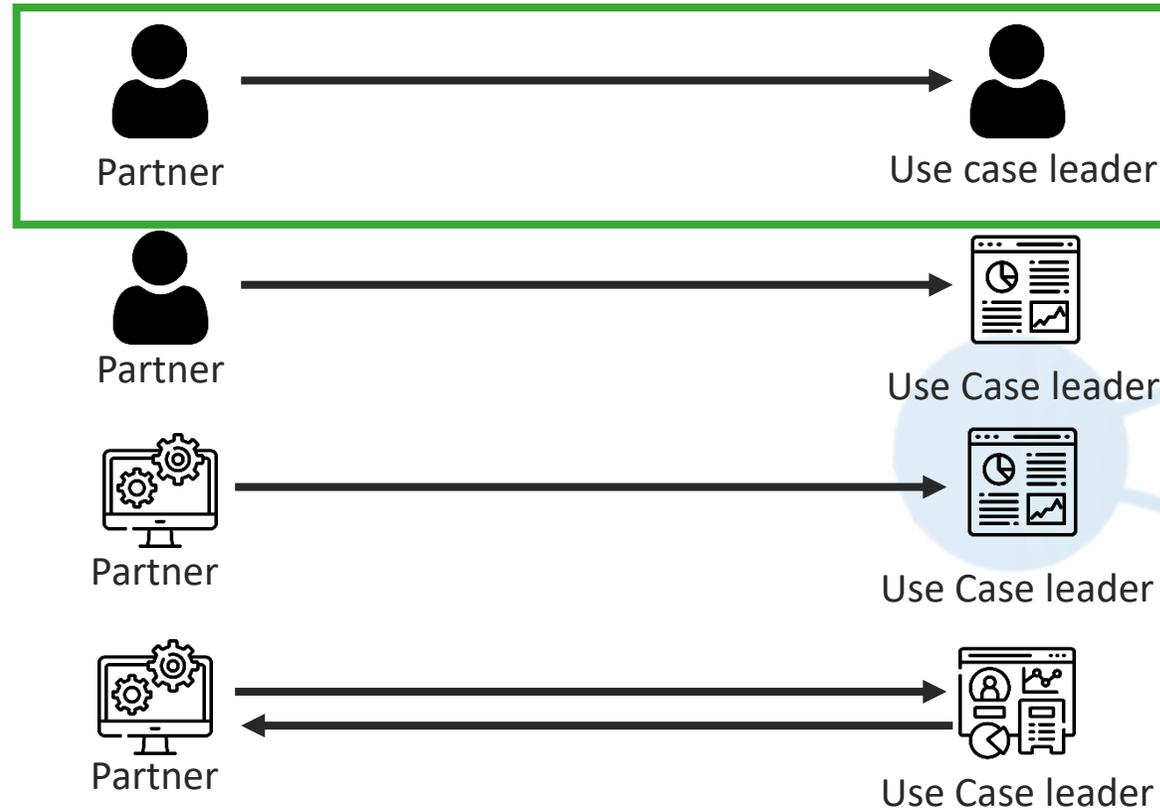
# Steps towards Federated Learning

- Handling secure interactions (*communications*):



# Steps towards Federated Learning

- Handling secure interactions (*communications*):



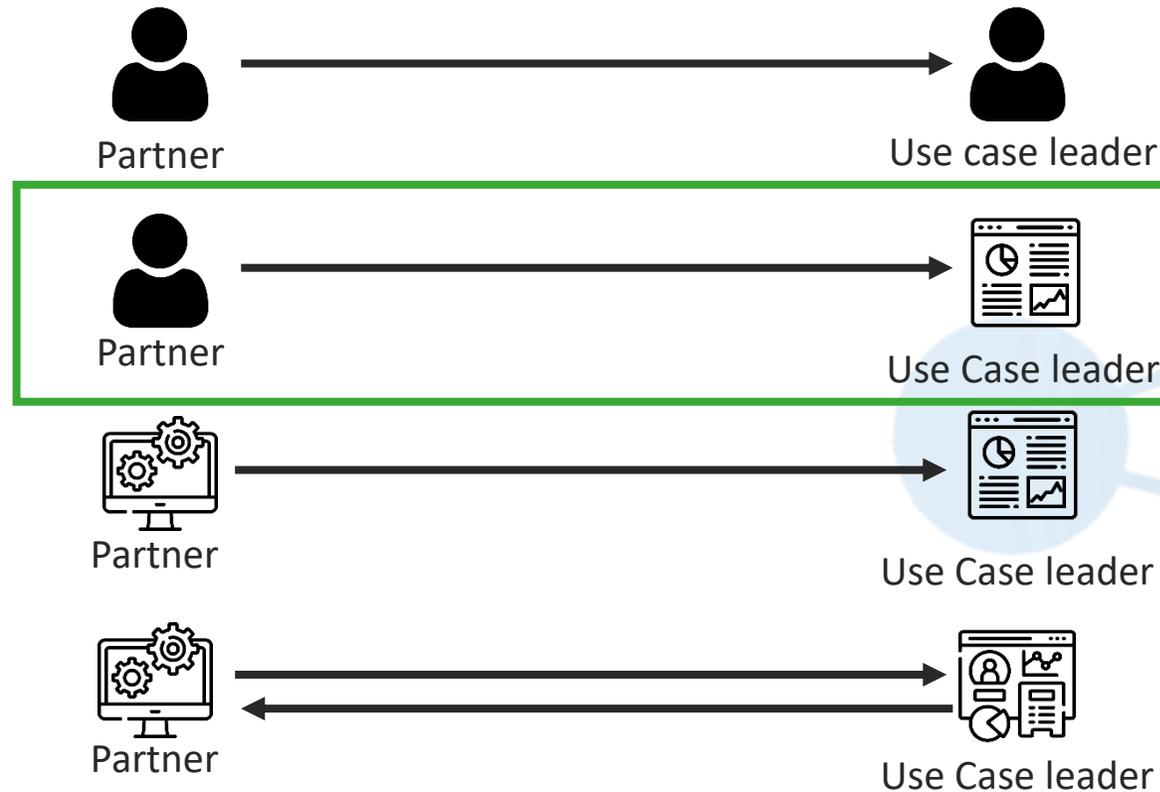
**USE CASE Development**

# Step-by-step plan towards Federated Learning

- Handling secure interactions (*communications*):
  - **TIER 0 – HUMAN to HUMAN interactions**
    - Example: *Each participant partner execute the analyses and **sends an e-mail with a) the data quality report and b) the aggregate data attached to the use case leader** for each use case in which they are participating*
  - TIER 1 – HUMAN to MACHINE interaction (with user interface)
    - Example: *Each participant partner execute the analyses, logs into a website (i.e. health information portal) with user authentication and upload the data quality report and the aggregated data to enable further meta-analysis or comparison by use case leaders*
  - TIER 2 – MACHINE to MACHINE one-way (automating retrieval of the outputs)
    - Example: *Each participant partner execute the analysis and press “Send outputs” to submit the data quality report and the aggregated outputs to a common repository enabling further meta-analysis or comparison by use case leaders*
  - TIER 3 – MACHINE to MACHINE two-way (distributing algorithms – federated learning)
    - Example: *Each participant partner configures an environment where the required data is available for analyses, and manages authorization for the deployment and execution of analytical algorithms on their data and the authorization for sharing their outputs*

# Step-by-step plan towards Federated Learning

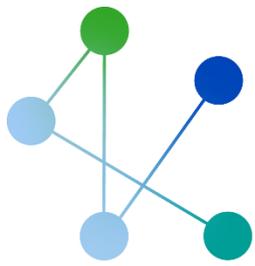
- Handling secure interactions (*communications*):



**USE CASE Demonstrators**

# Step-by-step plan towards Federated Learning

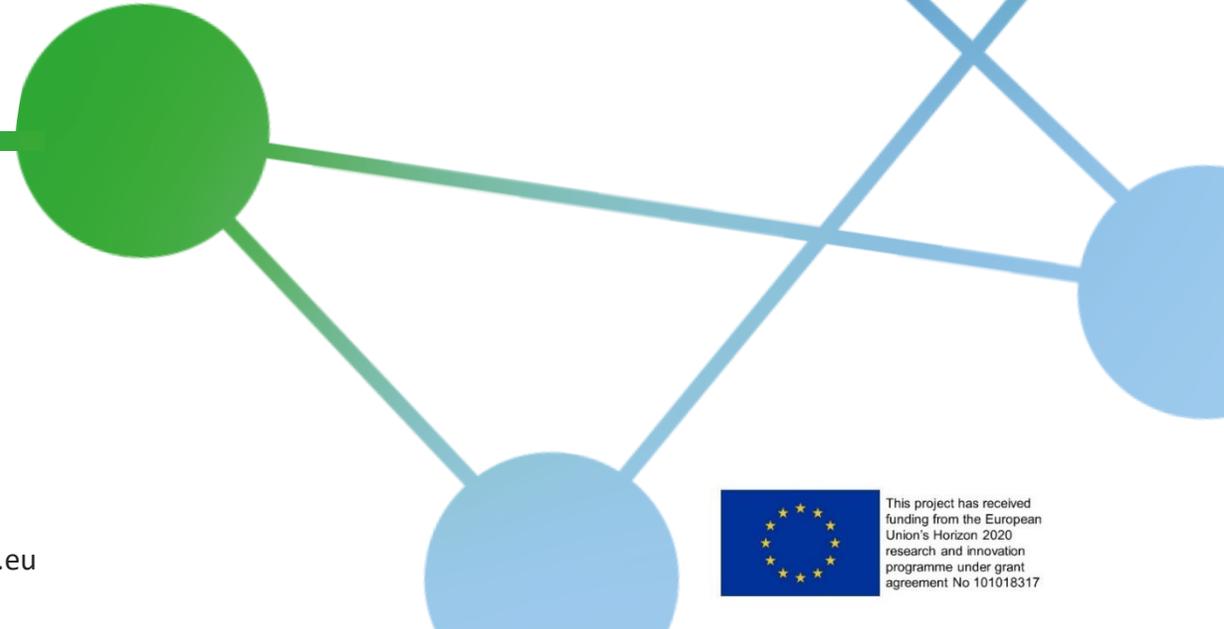
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## PHIRI app Demonstrator



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HOME - SERVICES STYLE I - FEDERATED DEMONSTRATORS - PHIRI USE CASE B DEMONSTRATOR

## PHIRI USE CASE B DEMONSTRATOR

PHIRI has developed a variety of tools that can be immediately reused by researchers interested in doing research reusing observational data. These tools have been implemented and tested to support the development of a variety of studies on the indirect effects of the COVID19 pandemic [<https://www.phiri.eu/wp6>].

Tools in PHIRI are digital objects that researchers can download, adapt and apply to their own research questions. Among those digital objects you will find [common data models](#), [including synthetic data sets](#), [quality assessment scripts](#) and [analytical algorithms](#) and the [PHIRI app](#).

PHIRI has also developed this interactive demonstrator that will enable you to participate in one the research PHIRI projects. If you are interested in the delay of treatments in breast cancer women during the period of movement restrictions in April 2020, you will be able to run your analyses locally using the PHIRI methodology and compare your results with those in the rest of the countries.

Take first a look at the current [comparative analyses](#). Now, see how you have to proceed using the [PHIRI App](#). Now, download the PHIRI App, run your analyses and [upload your results](#). Enjoy the journey.



PHIRI Federated Analysis

Home

Data mapping

General analysis

Process control

Outputs retrieval

Version: 2.2.5



### USE CASE A Vulnerable populations

Has the COVID19 pandemic changed existing patterns of non-COVID-19 health care utilisation and mortality for vulnerable populations within and between countries?

[CHECK THE DATA MODEL HERE!](#)

### USE CASE B Delayed treatment in breast cancer

Has there been any increase in surgical and/or co-adjuvant (i.e. radiotherapy, chemotherapy, immunotherapy) treatments delay in eligible women diagnosed of breast cancer, as a consequence of the COVID19 crisis?

[CHECK THE DATA MODEL HERE!](#)

### USE CASE C Perinatal health

Focus on the indirect effects of the COVID-19 pandemic on maternal and newborn health with a focus on potential inequalities regarding non-deferrable healthcare needs and risks of adverse perinatal outcomes due to stress and social deprivation.

[CHECK THE DATA MODEL HERE!](#)

### USE CASE D Mental health

Has there been any increase in individuals with mental health risk factors or mental disease, as a consequence of the COVID19 crisis? This case study will measure changes in population mental health and healthcare utilisation associated with the COVID-19 pandemic.

[CHECK THE DATA MODEL HERE!](#)

### COVID-19 Demostration pilot

Evolution of the SARS-CoV-2 pandemic

[CHECK THE DATA MODEL HERE!](#)



## PHIRI WP6 USE CASE B (DEMONSTRATOR)

Interactive report

PUBLISHED  
October 5, 2022

LAST UPDATED: 2023-03-13

[Print PDF](#)

### ABSTRACT

**Objectives:** To study the indirect impact of COVID-19 pandemic in healthcare services by assessing changes in the trend of time to first treatment in women diagnosed with breast cancer at the beginning of the pandemic.

**Design:** Observational retrospective longitudinal study based on aggregated data in several countries.

**Eligibility:** Women 18 years old or older treated for breast cancer between 2017 and 2021.

**Data sources:** Aggregated data on number of treatments and median time to first treatment from each country participating in the study, and Eurostat (European Commission) population data as reference population for direct standardization.

**Data analysis:** Aggregated data of the participants countries were used to detect changes in the evolution of women treated for breast cancer and in time-to-first-treatment for those women by a statistical retrospective analysis. This was followed by a structural breakpoints analysis and a forecasting study aimed at measuring the impact of breakpoints located after COVID-19 surge. Finally, several segmented regression models were built to explore some contextual variables related to the observed changes.

### DESCRIPTIVE ANALYSIS

International comparison of the age distribution of women diagnosed with breast cancer who underwent treatment during the study period.

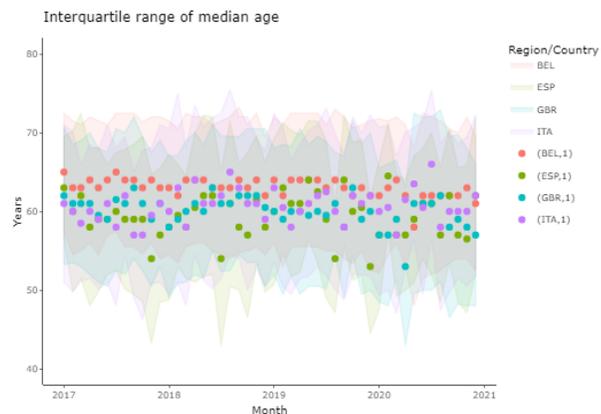


Figure 1: Median age and IQR by country each period

International comparison of the first treatment after a breast cancer diagnosis by type in percentage.

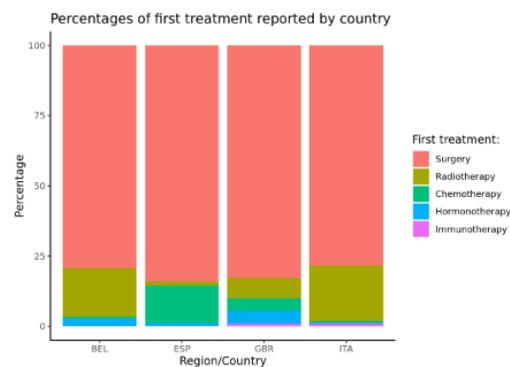


Figure 2: Barplot (in percentage) for the first treatment by country

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- RESULTS
- Descriptive analysis
- Breakpoints
- Forecast
- Regression Models
- DISCLAIMER

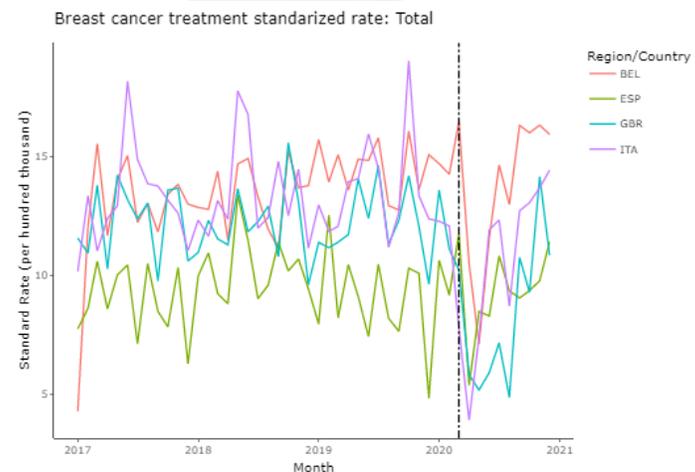


Figure 3: Breast cancer treatment standardized rate

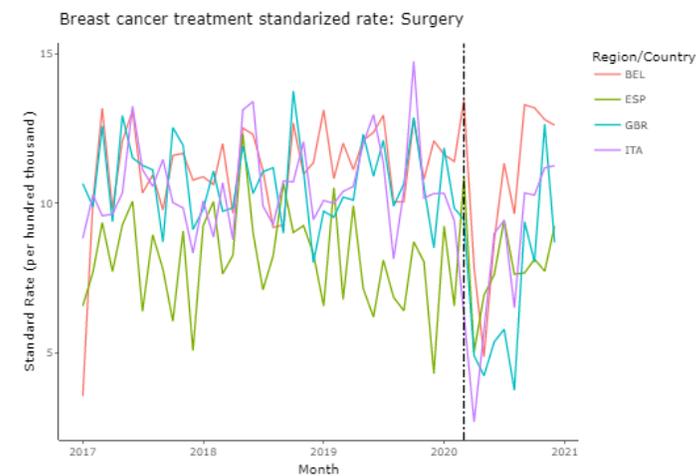
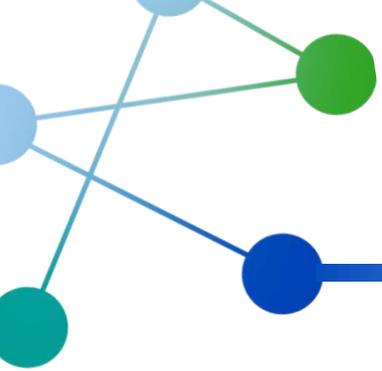


Figure 4: Breast cancer treatment standardized rate

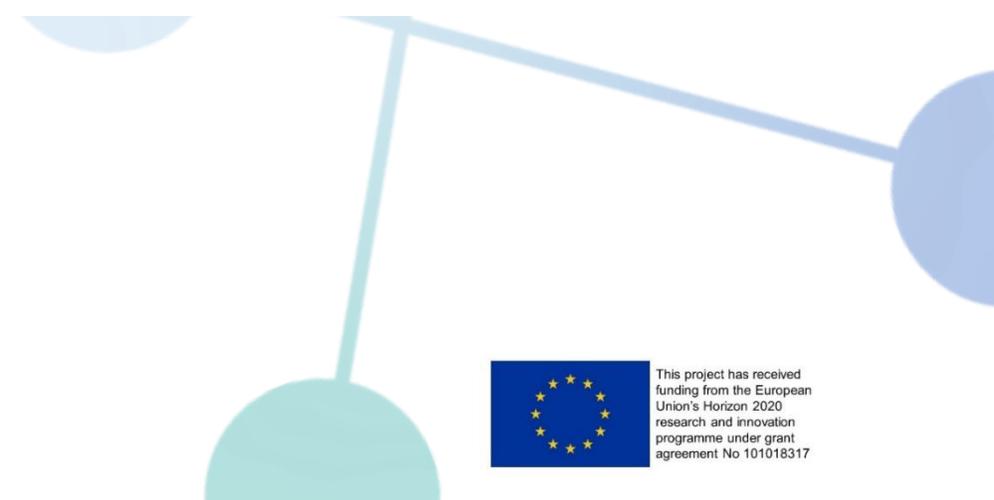
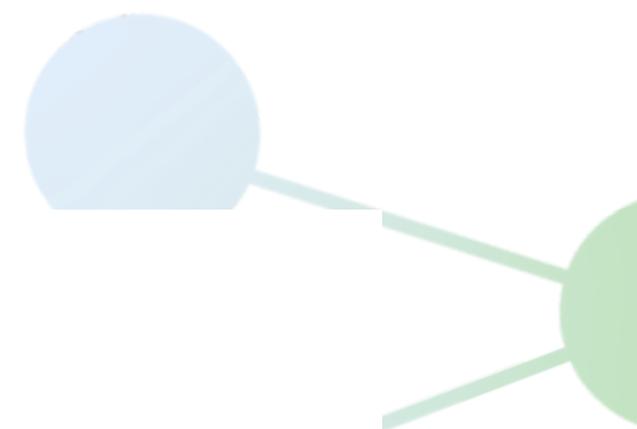


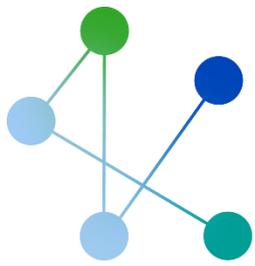
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# Thank you!



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