



# A European standardization framework for data integration and data-driven *in-silico* models for personalised medicine

Annual meeting 2022 - Introduction

Marc Kirschner, coordinator on behalf of the EU-STANDS4PM consortium m.kirschner@fz-juelich.de





# At a glance

- ➡ Type: Horizon2020 Coordination and support action
- ⇒ Project duration: 4 years (Jan 2019 Dec 2022)
- ➡ Consortium: 16 partners, 8 EU countries
- ⇒ Budget: 2.0 Mio €
- Coordinator: Forschungszentrum Jülich GmbH, Project Management Jülich

**Major objective:** To establish a forum to develop recommendations, guidelines and standards for in silico models in personalized medicine.





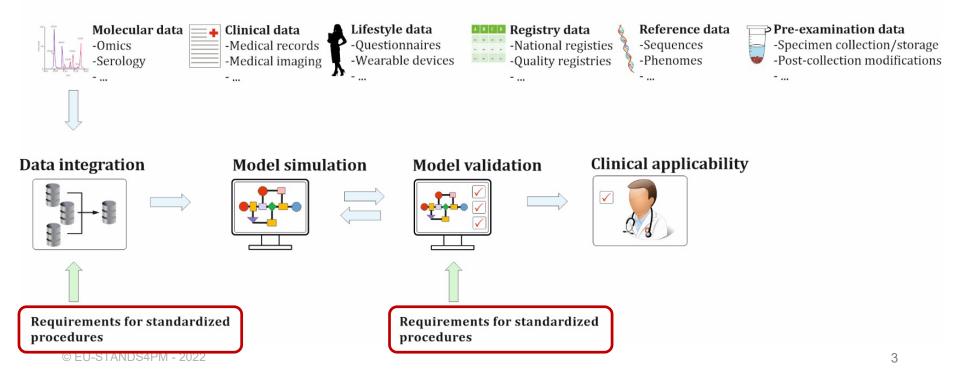
# Data and models for personalized medicine

### Models addressing clinical questions



Response to therapy Risk prediction Pharmacodynamics Pharmacokinetics In silico clinical trials

#### Possible data collections







## **Project structure and output**



WP3-Legal&ethical frame

WP1-Data sources

In silico models

**WP2-**

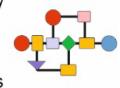
WP4-Data access& governance (pilot)

WP4-Awareness

### Models for personalized medicine



Response to therapy Risk prediction Pharmacodynamics Pharmacokinetics In silico clinical trials



### **Recommendations and standards for**

- Data integration and model validation
- ⇒ Ethico-legal issues and needs
- ⇒ Data governance

### **Target communities**

- ⇒ European collaborative research
- ➡ Funding organizations





### 18 May 2022 – EU-STANDS4PM annual meeting part I

#### Welcome

10:00 - 10:15	Introduction Marc Kirschner, Forschungszentrum Jülich, Germany	
Presentations of project output by work package and task leaders		
10:15 - 10:45	A catalogue of personalized medicine reference data Niklas Blomberg et al., EMBL-EBI ELIXIR, United Kingdom	
10:45 - 11:00	Innovative data governance for collaborative research projects: A new harmonized data access agreement for controlled access data. Stephan Beck, University College London, United Kingdom	
11:00 – 12:00	The legal and ethical framework necessary to develop lawful and ethical data integration in a fair and transparent way, respecting patients' rights. Mette Hartlev, University of Copenhagen, Denmark Miranda Mourby, University of Oxford, United Kingdom Eugenijus Gefenas, Vilnius University, Lithuania	
12:00 - 12:30	Virtual coffee break	
12:30 – 13:30	Development of community-based guidelines and normative documents: Recommendations and requirements for predictive computational models in personalised medicine Lars Küpfer, RWTH Achen University, Germany Catherine B. Collin University of Copenhagen, Denmark Martin Golebiewski, HITS gGmbH, Germany	
13:30 - 14:15	<b>Moderated discussion</b> : Q&A session to EU-STANDS4PM project output Catherine B. Collin, University of Copenhagen, Denmark	





#### 19 May 2022 - EU-STANDS4PM annual meeting part II

#### Welcome

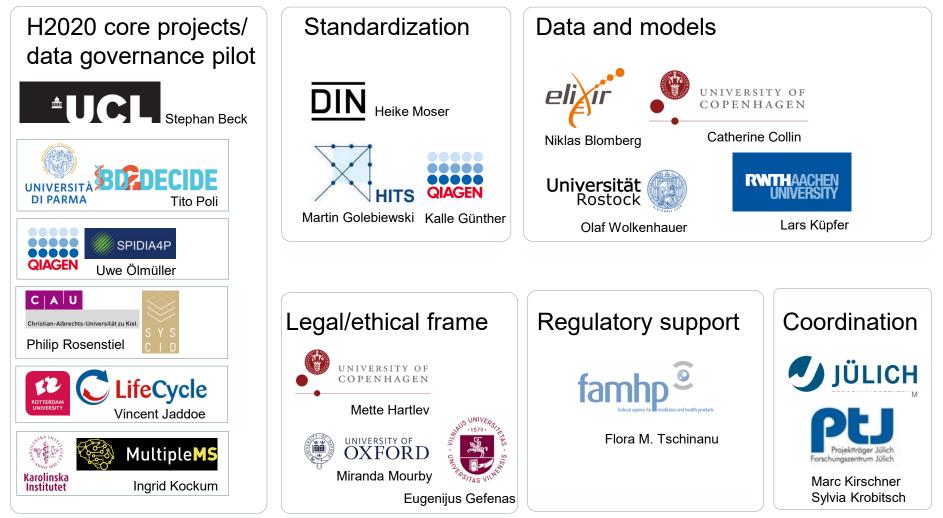
welcome		
10:00 - 10:05	Introduction Marc Kirschner, Forschungszentrum Jülich, Germany	
Presentations by invited speakers		
10:05 – 10:30	-The SimCardioTest project and verification & validation of in-silico models -Standards in VPHi Liesbet Geris (University of Liège, Belgium)	
10:30 – 10:45	<b>EU4CHILD – A crowdsourced ecosystem to fight childhood cancer</b> Alberto Tozzi (Ospedale Pediatrico Bambino Gesù, Rome, Italy)	
10:45 – 11:15	Challenges for clinically driven research: Guidelines for implementing computational models in clinical integrated decision support systems Tito Poli (University of Parma, Italy)	
11:15 – 11:30	Coffee break	
11:30 - 12:00	The role of standards in EU funded collaborative research projects Gergely Tardos (European Commission, DG Research & Innovation, Belgium)	
12:00 - 12:30	Computational modeling and simulation in medicine – challenges and needs for standardization Regina Geierhofer (Siemens Healthineers, Technical Regulations & Standards, Secretary IEC TC62, SC62B und SC62C, Germany) Charlott Danielson (Fraunhofer Research Institution for Individualized and Cell-Based Medical Engineering (IMTE), Germany)	
12:30 - 13:00	Lunch break	
13:00 - 13:30	ISO standards relevant for personalized medicine Heike Moser (DIN, Germany) Martin Golebiewski (HITS gGmbH, Germany)	
13:30 - 14:15	Moderated discussion: Implementation strategies for the standard documents developed	

ca. 14:15 Closure





### The players and their key tasks







## **Acknowledgements**

# EU-STANDS4PM is funded by the European Union Horizon2020 framework programme of the European Commission, Directorate-General for Research and Innovation under Grant Agreement # 825843.





# Thank you for joining the EU-STANDS4PM annual meeting 2022!





# A European standardization framework for data integration and data-driven *in-silico* models for personalised medicine

### WP1: Data sources and standards for predictions in personalized medicine

Niklas Blomberg, ELIXIR, <u>niklas.blomberg@elixir-europe.org</u> Ingrid Skelton Kockum, KI, Martin Golebiewski, HITS, martin.golebiewski@h-its.org

Partners: HITS, KI, EMBL, ELIXIR, DIN, UCPH, Bayer, QIAGEN, ERASMUS





### WP1 - Data sources and standards for predictions in personalized medicine

- > Objective 1: To establish a pan-European standardization framework for in silico methodologies applied in personalized medicine
- > Objective 2: To develop pan-European, generally admitted recommendations for standardization guidelines for in silico methodologies applied in personalized medicine

A central goal of WP1 is to produce an overview of existing relevant data sources and domain-specific data standards already in use by various scientific research communities.

The proposed EU-wide mapping process thus focuses on

- 1. European data-bases, collections and registries,
- 2. current personalized/systems medicine projects
- 3. good examples/successful case studies for integrating phenotype and large-scale data.





## Tasks

<u>Task 1.1</u> Survey of European and international reference databases, collections and registries for personalized medicine *(Lead: Ingrid Kockum, KI)* 

Task 1.2 Harmonizing data and metadata standards, minimal information guidelines for reporting and international standardization efforts (Lead: Martin Golebiewski, HITS)

<u>Task 1.4</u> Preparations for the development of European level standardization documents with regard to interoperability of health-related data (*Heike Moser, DIN*) -> Operationally merged with Task 1.2

Task 1.3 Assembling successful case-studies — examples and good practice for integrating phenotype and large scale data





# Task 1.1 Survey of European and international reference databases, collections and registries for personalized medicine

**Aim:** Survey existing data resources, collections and registries relevant for personalized medicine

### **Deliverable 1.1: Survey of available relevant data sources**

- > Survey was open for 6 months (November 2019 April 2020)
- Targeted to key contacts such as research infrastructures, national cohorts, consortiums
- > Online survey with 92 questions
  - > 5 general
  - > 52 datasources and standards
  - > 32 modeling methods and standards
  - > 3 data access consent
- > 71 respondents
  - > 11 EU countries, UK and US









Ali Manouchehrinia Karolinska Insitutet

Arshiya Merchant Niklas Blomberg Elixir Elixir

Ingrid Kockum Karolinska Insitutet

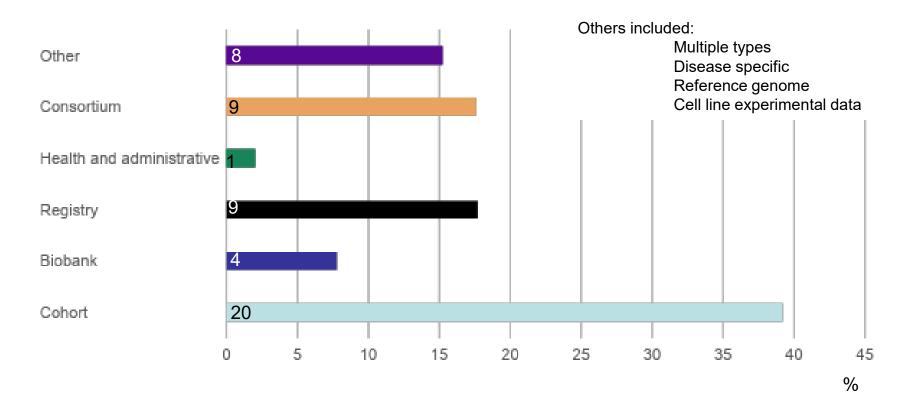
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Data



## What is the type of dataset?

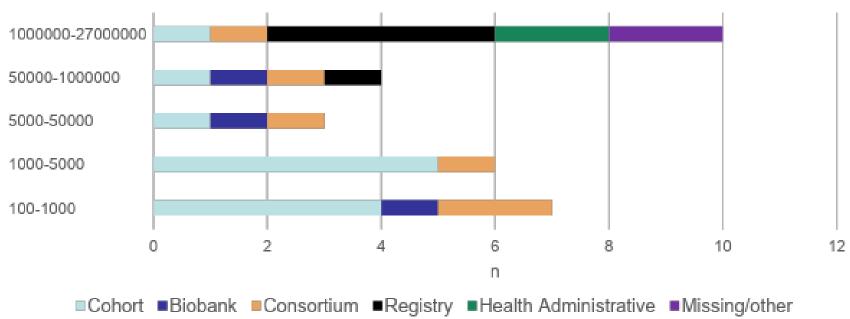


### Most common type of study was cohort study which also includes case-contol studies





# What is the number of individuals in the dataset?



### Size of data source

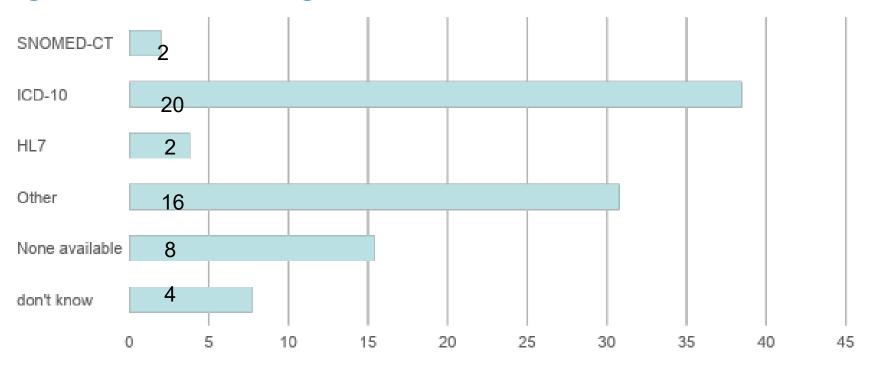
### Big variation in the size of the data set covered



Data



# What are the existing standard formats, format guidelines, ontologies etc?



Others include:

Open EHR, Plink, SNPtest, RedCap, ICD9, READ v1-3CT, DM6D, NHS A&E, CLOSER ontology (consortium specific), ATC and NUP codes, bam, vcf, DICOM + contact details to person who knows

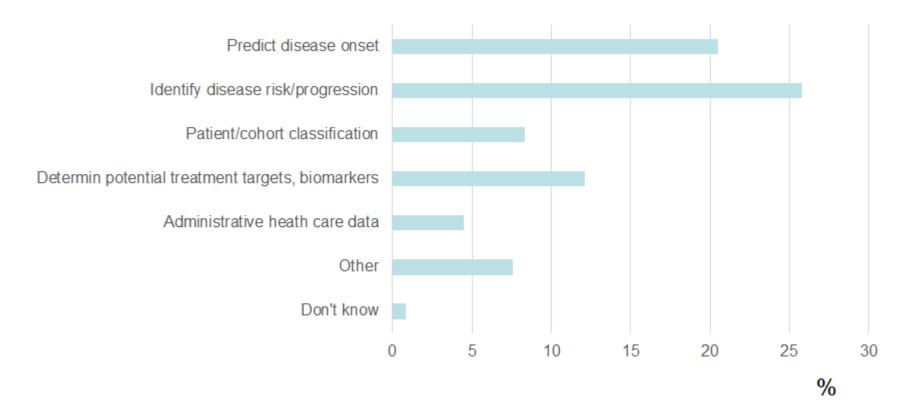
### Most commonly used standard is ICD10/9. Many do not use any standard.

%





### What is the main research question/aim?

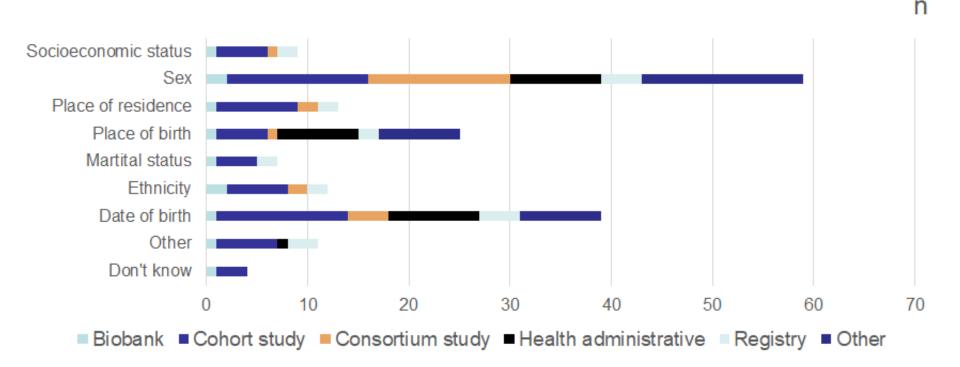


# Most commonly addressed research question is identification disease risk/progression and disease onset





### What demographic data is being collected?



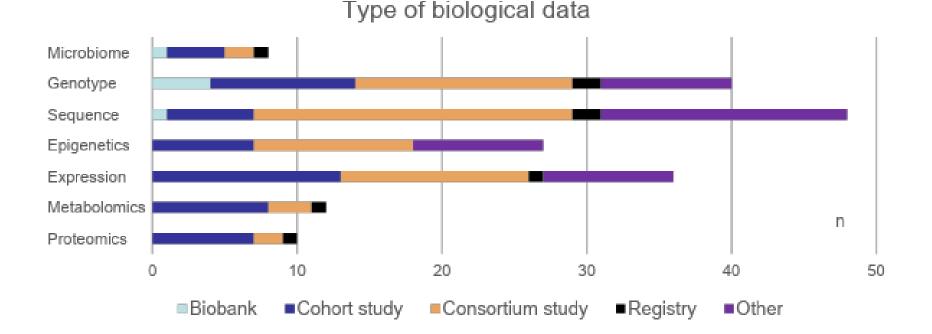
### Sex is collcetd in almost all datasets, date of birth is also common



Data



## Is biological data being collected? What type?

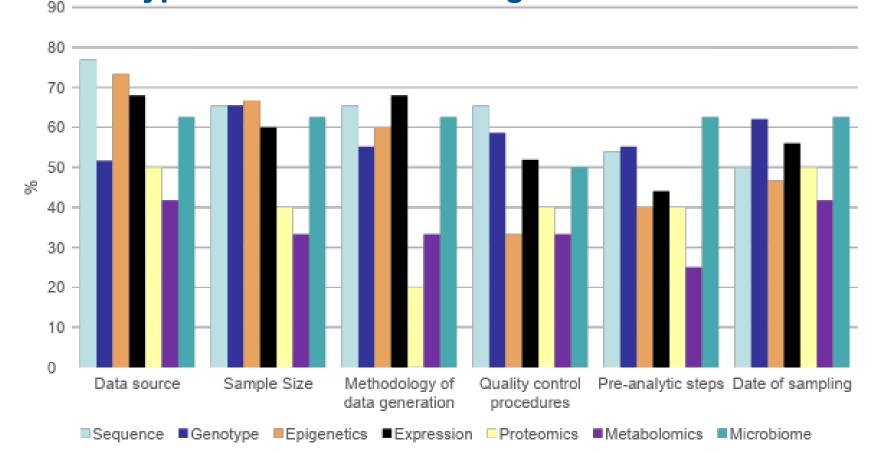


Genotypes and sequence data most common type of biological data followed by expression and epigenetics Microbiome, metabolomics and proteomics rarely included





# What type of meta data is being collected?



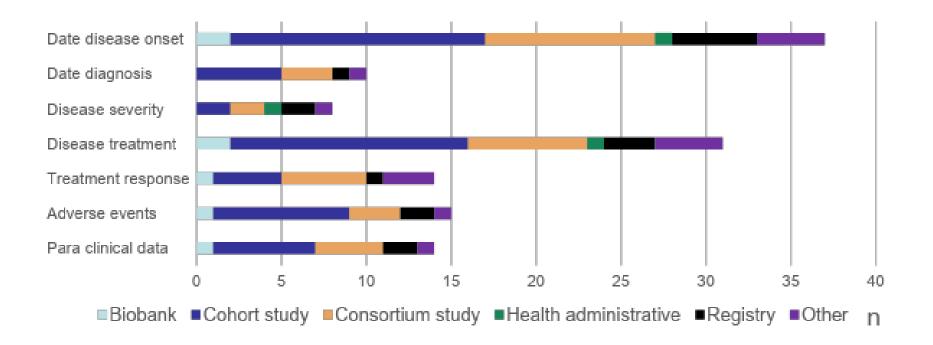
# Meta data is not always collected. Date of sampling and pre-analytic steps seems to be especially badly captured



Data



### **Disease specific data**



### Disease onset and treatment fairly frequently captured. Treatment response and adverse events rarely captured



Data



### **Conclusions data types and standards**

- > Large variety in type of datasets/studies
  - > Design, size, country of origin
- > ICD10 & ICD9 most commonly used standards
- > Sex and date of birth most common demographic data
- > Metadata for biological data often missing
- Medication not that often captured, ATC standard not that commonly used
- ICD not so often used for hospitalization and co-morbidity data
- Central data for personalised medicine such as response to treatment and adverse events are not capture so often
- > Room for standardization





# D1.1 EU-wide mapping report with focus on international databases collections and registries

This report will describe and develop:

- > A comprehensive catalogue of data resources relevant to personalized medicine.
- Leverage data catalogues developed within the European
   Open Science Cloud (EOSC) and the related and developing
   European Health and Innovation Cloud (HRIC).
- A forward looking action plan with recommendations, especially to policymakers and funders that will support responsible and secure data sharing and access to reference data across borders.





### **Report: Type of data sources reviewed**

- Data Repositories
- > Reference Databases
- Case-control data
- Cohort Data
- Biobank Data
- Patient Registries
  - Research or Clinical-Led Registries
  - Patient Powered Registries
- Clinical Trial Registries
- Administrative Health Data
- Adverse events database
- Results from survey





### **Report: Identified gaps**

- Distinct lack of metadata & pre-processing data that comes along with "core data"
- Little information tracking the treatment regimens patients' were prescribed, and tracking of their response to these treatments.
- > There is a lack of generic 'terminology' for the collection, analysis, and interpretation of data.





### **Report: Recommendations**

- > Metadata on pre-processing of data needs to be captured
- Standard terminology should be used in funders documentation to ensure a similar level of understanding and awareness for both policymakers and researchers
- Accessibility to health data from different jurisdictions will promote acceleration of PM research. Clear role for federated EGA for data deposition and access.





# 1.2. Harmonizing data and metadata standards, minimal information guidelines for reporting and international standardization efforts

Martin Golebiewski HITS gGmbH (Heidelberg, Germany) <u>martin.golebiewski@h-its.org</u>

# 1.4. Preparations for the development of European level standardization documents with regard to interoperability of health-related data

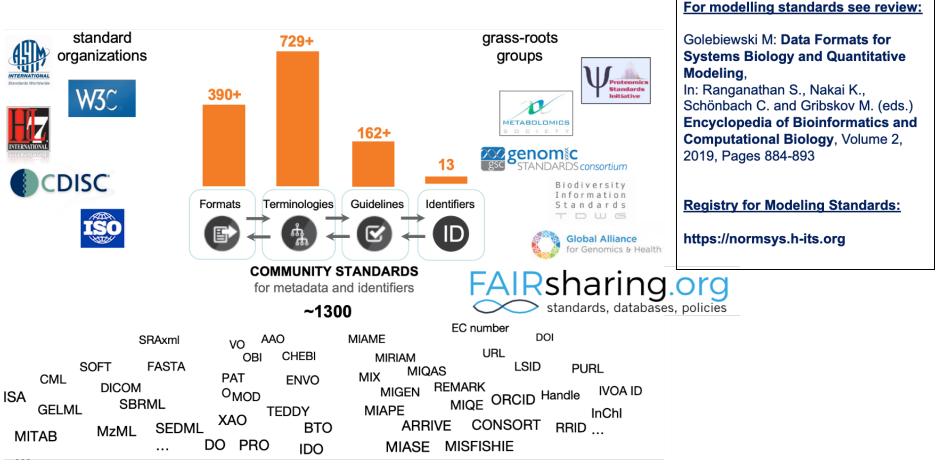
Heike Moser DIN German Institute for Standardization <u>heike.moser@din.de</u>







### The Forest of Standards in Life Sciences



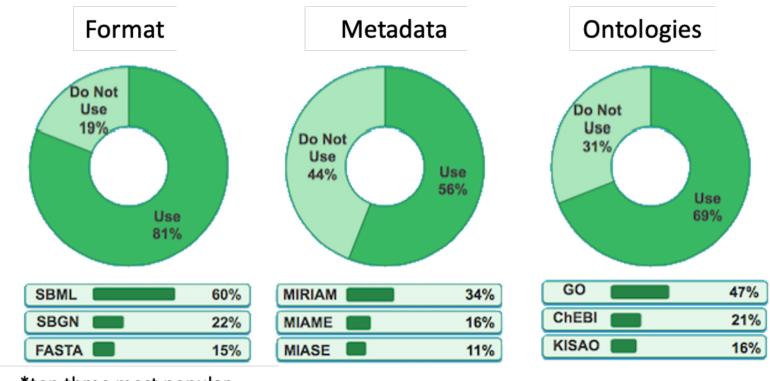
Source: Susanna-Assunta Sansone (University of Oxford, UK)



T1.2 / T1.4



### **Researchers do not always use data standards**



\*top three most popular

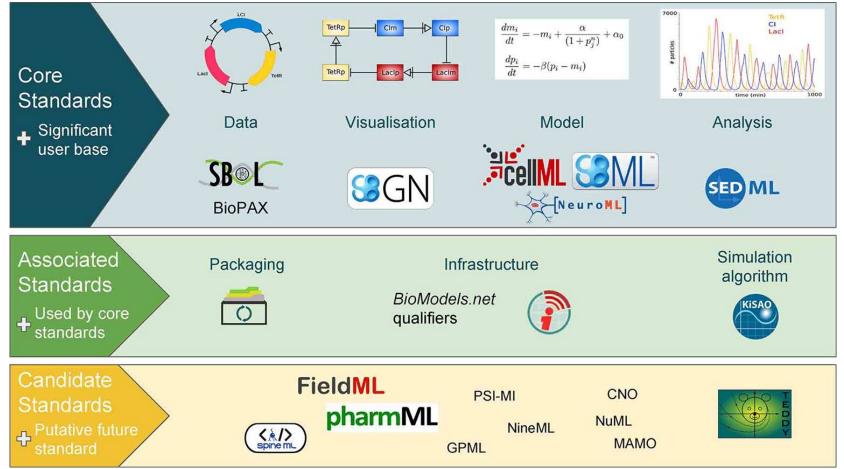
The evolution of standards and data management practices in systems biology (2015). Stanford, Wolstencroft, Golebiewski, et al., Molecular Systems Biology, 11(12):851







# **Computational Modelling in Biology**

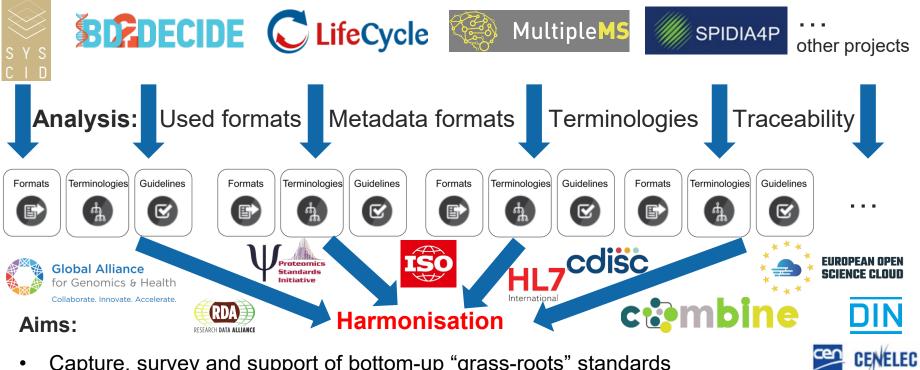


Schreiber F, Sommer B, Czauderna T, Golebiewski M, Gorochowski TE, Hucka M, Keating SM, König M, Myers C, Nickerson D, Waltemath D: **Specifications of standards in systems and synthetic biology: status and developments in 2020.** J Integr Bioinform. (2020) 17(2-3): 20200022. doi: 10.1515/jib-2020-0022









- Capture, survey and support of bottom-up "grass-roots" standards
- Ensure interoperability for cross-domain and cross-technology data integration
- Guidelines & recommendations for using (meta-)data standards in personalised medicine
- Interface with corresponding international standardisation communities
- Promote the long-term sustainability of the standards together with the European Open • Science Cloud (EOSC), ESFRI infrastructures and relevant standardisation committees (ISO/TC 276/WG 5 Data processing and integration & ISO/TC 215 Health informatics, ...) © EU-STANDS4PM - 2022





# **Collecting requirements from and engaging in relevant scientific standardization communities (T1.2)**

# Collaborations with standardization communities initiated:

- > GA4GH (Global Alliance for Genomics and Health)
- > HL7 (Health Level Seven International)
- > CDISC (Clinical Data Interchange Standards Consortium)
- COMBINE (Computational Modeling in Biology Network)
- ModeleXchange community (is currently forming)

# Contact to FAIR data communities established:

- > FAIRsharing.org (resource on data standards, databases and policies)
- > Identifiers.org (registration and resolution service for persistent identifiers)

# Contribution to COVID-19 Guidelines and Recommendations from RDA (Research Data Alliance):

https://doi.org/10.15497/rda00052

- > Recommendations for the sharing of COVID-19 clinical data
- > Reference to EU-STANDS4PM harmonized data access agreements (WP4)
- > Reference to EU-STANDS4PM legal framework document (WP3)







# **Collecting requirements from and engaging in relevant scientific standardization communities (T1.2)**

- EU-STANDS4PM stakeholder workshop at COMBINE2019 on July 18, 2019 at HITS in Heidelberg (Germany)
  - > Co-located with COMBINE 2019 with >100 attendees from 18 countries
  - > Workshop report published in JIB in 2020 (special issue)
  - > COMBINE meeting report also published in JIB in 2020









# D1.2 EU-wide mapping report on good practice examples for integrating phenotype and large scale data

Report will provide:

- Collection of examples and good practice of current personalised medicine and systems medicine projects applying data standards
- Overview on relevant data standards, terminology standards and minimal information guidelines (with a domain-specific FAIRSharing collection)
- Needs and gaps for standardizing data input and quality of modelling results as major focus (model itself often is a "black box")

Report will be based on:

- Outcomes from EU-STANDS4PM workshop at COMBINE 2019
- Outcomes from EU-STANDS4PM workshop: Using patient derived data for in silico modelling in personalized medicine (February 2020)
- Deliverable D1.1 and WP2 white paper
- Input from grass-root standardization communities (e.g. COMBINE, GA4GH Phenopackets, ModeleXchange community, etc.)
- Experience from SDOs (HL7, CDISC, ISO/TC 215 and ISO/TC 276, etc.)





# **Community Activities in T1.2/T1.4**

- Pafticipation in a EC stakeholder workshop on 'Human Digital Twin' on November 6th, 2020 (with a short presentation by M. Golebiewski on "Establishing and harmonizing technical standards, and (potential) key performance indicators" that highlighted EU-STANDS4PM recommendations)
- > From the key take away messages of the workshop:
  - "There is a <u>need for establishing an inclusive ecosystem around Digital Twins for Healthcare,</u> <u>comprising relevant actors to share knowledge, foster collaboration and bring together diverse</u> <u>groups of stakeholders</u>, including patient representatives, academia, research organisations, industry representatives, regulators and evaluators (i.e. HTA institutions, regulatory bodies) and health care payer organisations, involving clinicians in all steps of the development and clinical implementation. The ecosystem's goals are:

1. to <u>build on and integrate (existing) technologies and disciplines, develop terminologies,</u> <u>establish and set standards;</u>

 to facilitate the <u>development of adapted evaluation/assessment tools for developers and</u> <u>regulators</u> including a clear benchmarking framework to integrate digital twins and modelbased approaches for regulatory purposes paving hereby the way for more targeted therapeutics;
 to bridge the 'valley of death' for the <u>commercial uptake</u> of digital twins or other in silico approaches;

4. to ensure proper representation of the <u>end-users' perspective</u>, including regulators, patients, healthcare professionals and payers."





## **Community Activities in T1.2/T1.4**

- Pafticipation in the Putting Science into Standards (PSIS) 2021 Workshop
   'Organ on Chip: Towards Standardization' organized by the Joint Research
   Centre of the European Commission (JRC) and the European Standardization
   Organizations CEN and CENELEC on April 28th-29th, 2021
- focused on Organ-on-Chip (OoC) or Micro Physiological Systems (MPS), innovative devices that emulate human/animal biology and can reproduce one or more aspects of an organ's functionality
- <u>Session "Standards for Data acquisition and management"</u> chaired by M. Golebiewski" (with introductory presentation, including an overview about relevant EU-STANDS4PM activities)
- > From the key messages:
  - OoC/MPS and in silico modelling should go hand-in-hand
  - standardizing workflows, data and models is crucial





# **Progress in "formal" standardization (see also WP2)**



- EU-STANDS4PM Strategy document "Development of formal standard documents" (access via the EU-STANDS4PM intranet)
- > EU-STANDS4PM recognised as liaison organization for ISO/TC 276 Biotechnology and ISO/TC 215 Health Informatics
  - > Easier access to standard drafts and possibility to influence the drafts
- WP1 experts contributed to the drafting of ISO 20691 "Requirements for data formatting and description in the life sciences for downstream data processing and integration workflows" (see intranet for contributions)
  - "framework" or "Hub" standard developed by ISO/TC 276/WG5
  - > refers to domain-specific standards (in the informative annex)
  - gives researchers a guideline for applying the standards in complex workflows (also for modelling in personalised medicine and related fields)
- ISO 20691 will be submitted next week by ISO/TC 276 as ISO Draft International Standard (DIS)
- > EU-STANDS4PM draft for an ISO Technical Specification (TS) submitted this week to ISO/TC 276/WG 5 Data Processing and Integration (see WP2)





## ISO 20691 Requirements for data formatting and description in the life sciences

2 Normative references

Foreword

1 Scope

Introduction

3 Terms and definitions

4 Criteria for formats and identifiers

5 Technical criteria and requirements

6 Semantic criteria and requirements

7 Requirements for ontologies suitable for annotation of biological data

8 Requirements for domain specific data standards

9 Requirements for data repositories for biological data

Annex A (informative) Recommended formats for life science data

Annex B (informative) Minimal reporting standards for data, models and metadata

#### will be submitted next week by ISO/TC 276 as ISO Draft International Standard (DIS)

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ISO/TC 276 Biotechnology WG 5 (Data Processing and Integration) works on a draft for a new ISO guideline standard for data in the life sciences:

Reference framework ("hub") standard for (non-ISO) community standards

- Requirements and rules for the concerted application of community standards for formatting, description and documentation of datatypes in the life sciences
- Catalogue of criteria and requirements for interoperable life science data formats and semantic data description standards







# **Summary**





>Relevant data landscape is highly complex - many actors, wide range of standards and access models. Opportunity: large datasets avaliable for reuse.

> Use of networking for describing requirements (e.g. experiences from H2020 projects, co-located workshop at COMBINE 2019 in Heidelberg, community survey, etc.)

Analysis of existing standards based on the requirements defined by experts from WP 1 (applicable, changed applicable, not available)

Contact with standardization bodies (ISO, CEN, DIN...) and SDOs (GA4GH, HL7,

CDISC, COMBINE) when standards need to be changed in order to adapt them

Help to increase interoperability of data (and data standards) for complex workflows in personalized medicine

Check whether there are bodies that can standardize the new standardization topics if necessary, initiate new Working groups

Create drafts (or contribute to drafting) for new or changing standards

>Publishing and advertising of the new/changed standards using the existing network





## Acknowledgements

EU-STANDS4PM is funded by the European Union Horizon2020 framework programme of the European Commission, Directorate-General for Research and Innovation under Grant Agreement # 825843.





# A European standardization framework for data integration and data-driven *in-silico* models for personalised medicine

#### **Benefits of Workflow Standardization in IVD Testing**

Dr. Kalle Günther QIAGEN GmbH kalle.guenther@qiagen.com







150,000 papers documenting thousands of claimed biomarkers, but fewer than 100 have been validated for routine clinical practice

Bring on the biomarkers, George Poste, Nature 2011

Diagnostic errors cause about 10% of all patient deaths and about 17% of adverse events

Institute of Medicine (IOM) Report Sept. 2015

The pre-analytical phase accounts for 46% to 68% of errors observed during the total testing process

Medical Laboratory Observer, May 2014

Unnecessary expenditure caused by pre-analytical errors in a typical U.S. hospital (~ 650 beds) of ~ \$1.2 million per year

Green SF. Clin Biochem. 2013

 Irreproducible preclinical research exceeds 50%, US \$28B / year spent on preclinical research that is not reproducible - in the US alone

*Freedman LP, Cockburn IM, Simcoe TS (2015) PLoS Biol 13(6):* e1002165.doi:10.1371/journal.pbio.1002165

#### **O** Demand for Improvements and Workflow Standardization







#### **Deficiencies in Routine Healthcare and Research**



• No information about important pre-analytical workflow parameters





#### An Analytical Test Result is the Result of an Entire Workflow





*European Conference (SPIDIA Booth). Standards -Your Innovation Bridge* 





#### New In Vitro Diagnostic Regulations 2017 (IVDR) in Europe

- > Pre-analytical workflow parameters in several sections
  - > 6. PRODUCT VERIFICATION AND VALIDATION (Annex II)
  - > 6.1. Information on analytical performance of the device
  - > 6.1.1. Specimen type

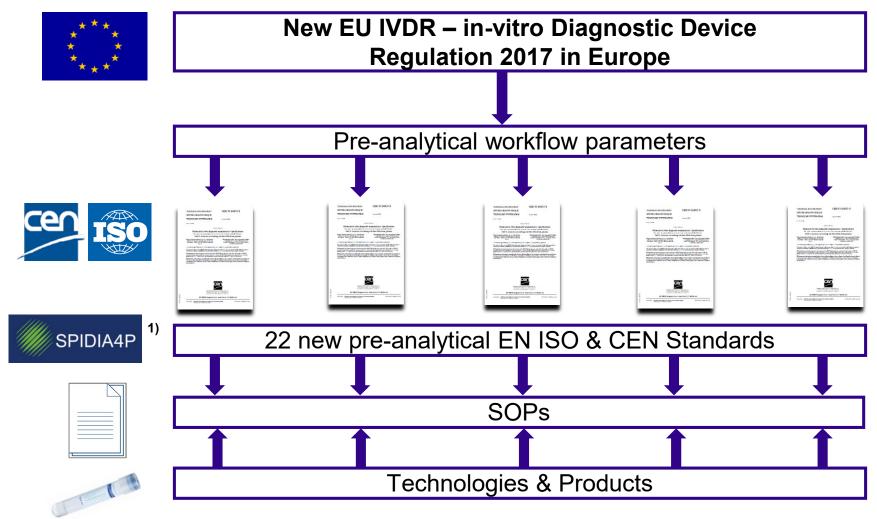
This Section shall describe the different specimen types that can be analysed, including their stability such as storage, where applicable specimen transport conditions and, with a view to time-critical analysis methods, information on the timeframe between taking the specimen and its analysis and storage conditions such as duration, temperature limits and freeze/thaw cycles

- European legislation requires to specify, develop, verify and validate the pre-examination phase for a dedicated examination development and regulatory approval
- → Standardization of examination workflows is becoming now essential from that perspective





#### **Role of Legislation, Standards and Technologies**



1) The SPIDIA4P project has received funding from the European Union's Horizon 2020 research and innovation programme under grant agreement no. 733112.



#### Example: ISO 20186-1 Venous whole blood - Part 1: Isolated cellular RNA

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Foreword         Introduction           1         Scope         Scope         Introduction           2         Normative references         Introduction         Introduction           3         Terms and definitions         Introduction         Introduction           4         General considerations         Introduction         Introduction           5         Outside the laboratory         Introduction about the specimen donor/patient         International about the specimen collection from the donor/patient a stabilization procedures           4         Information about the specimen and storage requirements at the bit inside the laboratory         Information about the specimen and storage requirements at the bit inside the laboratory           5.1         Storage requirements         6.1         Information about the specimen and storage requirements at the bit inside the laboratory           6.1         Inside the laboratory         Information about the specimen and storage requirements at the bit inside the laboratory inside the laboratory         6.3           6.1         Storage requirements         6.3         Isolation of the cellular RNA.           6.2         Storage requirements         6.3         Isolation of the cellular RNA.           6.3         Storage of solation cellular RNA.         6.5         Cellular RNA.           6.5.3         Cellular RNA isolated with t	iv v 1 1 5 6 6 6 6 6 6 6 6 6 6 1 7 8 8 8 8 8 9 9 9 9 10 10 10 10 10 10 10 10 10 10
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#### Outside the laboratory.

5

6

- 5.1 Specimen collection.
  - 5.1.1 Information about the specimen donor/patient...
  - 5.1.2 Selection of the venous whole blood collection tube by the laboratory.....
  - 5.1.3 Venous whole blood specimen collection from the donor/patient and stabilization procedures.....
  - 5.1.4 Information about the specimen and storage requirements at the blood collection facility.....
- 5.2 Transport requirements

#### Inside the laboratory

- 6.1 Specimen reception
- 6.2 Storage requirements
- 6.3 Isolation of the cellular RNA
  - 6.3.1 General...
  - 6.3.2 Using blood collection tubes with RNA profile stabilizers
  - 6.3.3 Using blood collection tubes without RNA profile stabilizers.....
- 6.4 Quantity and quality assessment of isolated cellular RNA
- 6.5 Storage of isolated cellular RNA
  - 6.5.1 General.....
  - 6.5.2 Cellular RNA isolated with commercially available kits
  - 6.5.3 Cellular RNA isolated with the laboratory's own protocols



Data collection at each pre-examination step!

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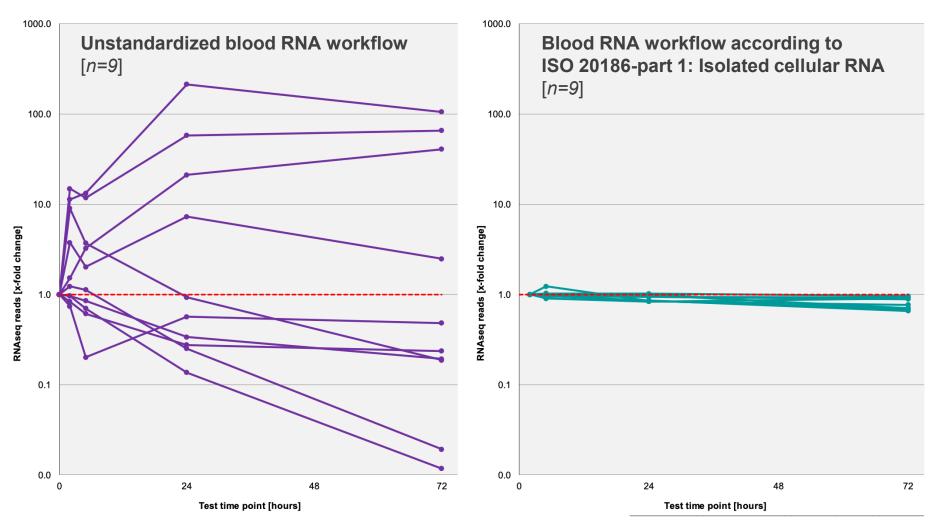
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#### **Reliable results due to workflow standardization (10 mRNAs)**



Unpublished data by K. Günther, QIAGEN GmbH 8





## Acknowledgements

EU-STANDS4PM is funded by the European Union Horizon2020 framework programme of the European Commission, Directorate-General for Research and Innovation under Grant Agreement # 825843.





# Work Package 2

# Integrative data analysis and in silico models in personalized medicine

## **Review article**

Computational Models for Clinical Applications in Personalized Medicine: Guidelines and Recommendations for Data Integration and Model Validation

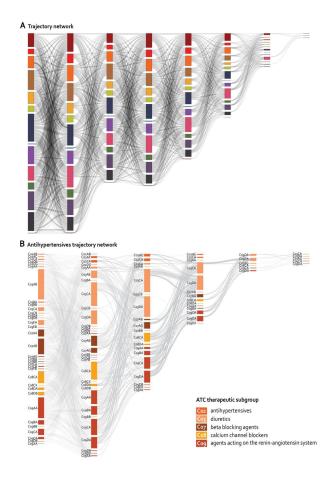
J. Pers. Med. 2022, 12(2), 166; https://doi.org/10.3390/jpm12020166 © EU-STANDS4PM - 2022





# Work Package 2 Trajectory

1) Case population							
		2) Diagnosis	s co-occurre	nces			
FA	CD	GA	EI	EB			
DE	BC	HD	FG	DA	BG		
CG	GE	AB	<b>€</b> © ↓	CI	HO		
3) Significant, directional diagnosis pairs							
	<b>D-E</b>	₿→€	H-D	6-	G		
	<b>0</b> +0	<u>(</u> ]+€	A→B	<b>()</b> -(	C		
4) Linear disease trajectories							
	A-	<b>B</b> • <b>C</b> • <b>D</b>	<b>H-D</b>				
	<b>()</b> -(	<b>0 • 0 • E</b>	<b>A-B</b>	• <mark>G-•E</mark>			
♦ 4) Disease trajectory network							
	0	4) Disease tra		je – (			



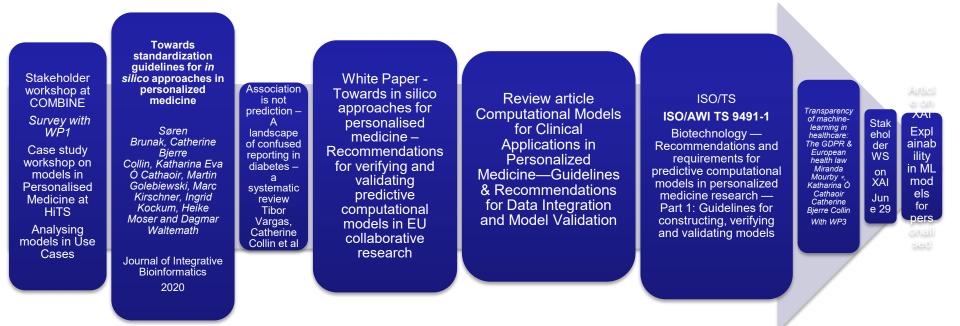
Aguayo-Orozco, A., Haue, A.D., Jørgensen, I.F. et al. Optimizing drug selection from a prescription trajectory of one patient. npj Digit. Med. 4, 150 (2021). https://doi.org/10.1038/s41746-021-00522-4

Siggaard, T., Reguant, R., Jørgensen, I.F. *et al.* Disease trajectory browser for exploring temporal, populationwide disease progression patterns in 7.2 million Danish patients. *Nat Commun* **11**, 4952 (2020). https://doi.org/10.1038/s41467-020-18682-4





# WP 2 trajectory: Integrative data analysis and in silico models for personalised medicine







#### Work flow and process of WP2: in silico models

Interaction with the community: Data collection: Survey Interaction with the community"Case Study" workshop on models for Personalised Medicine (HiTS) *Analysing models in use cases* 

#### White Paper: Analysis & Recommendations Requirements for data input and model validation

**Review article** Computational Models for Clinical Applications in Personalized Medicine—Guidelines and Recommendations for Data Integration and Model Validation

**ISO/TS** 

Focus area - Interaction with the community" - workshop on explainability in models for Personalised Medicine

Focus area - Article on XAI





**MDPI** 



#### Review

Model develor

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#### **Computational Models for Clinical Applications in** Personalized Medicine—Guidelines and Recommendations for **Data Integration and Model Validation**

Catherine Bjerre Collin<sup>1</sup>, Tom Gebhardt<sup>2</sup>, Martin Golebiewski<sup>3</sup>, Tugce Karaderi<sup>1,4</sup>, Maximilian Hillemanns<sup>2</sup>, Faiz Muhammad Khan<sup>2</sup>, Ali Salehzadeh-Yazdi<sup>5</sup>, Marc Kirschner<sup>6</sup>, Sylvia Krobitsch<sup>6</sup>, EU-STANDS4PM consortium <sup>†</sup> and Lars Kuepfer <sup>7,\*</sup>

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- Correspondence: lkuepfer@ukaachen.de; Tel.: +49-241-8085900
- + Coordinator contact of EU-STANDS4PM; Membership of EU-STANDS4PM consortium is provided in the acknowledgements.

Abstract: The future development of personalized medicine depends on a vast exchange of data from different sources, as well as harmonized integrative analysis of large-scale clinical health and sample data. Computational-modelling approaches play a key role in the analysis of the underlying molecular processes and pathways that characterize human biology, but they also lead to a more profound understanding of the mechanisms and factors that drive diseases; hence, they allow personalized treatment strategies that are guided by central clinical questions. However, despite the growing popularity of computational-modelling approaches in different stakeholder communities, there are still many hurdles to overcome for their clinical routine implementation in the future. Especially the integration of heterogeneous data from multiple sources and types are challenging tasks that require clear guidelines that also have to comply with high ethical and legal standards. Here, we discuss the most relevant computational models for personalized medicine in detail that can be considered as best-practice guidelines for application in clinical care. We define specific challenges and provide applicable guidelines and recommendations for study design, data acquisition, and operation as well as for model validation and clinical translation and other research areas.

Citation: Collin, C.B.; Gebhardt, T.; Golebiewski, M.; Karaderi, T.; Hillemanns, M.: Khan, F.M.: Salehzadeh-Yazdi, A.; Kirschner, M.; Krobitsch, S.; EU-STANDS4PM consortium; et al. Computational Models for Clinical Applications in Personalized Medicine-Guidelines and Recommendations for Data Integration and Model Validation. J. Pers. Med. 2022, 12, 166. https:// doi.org/10.3390/jpm12020166

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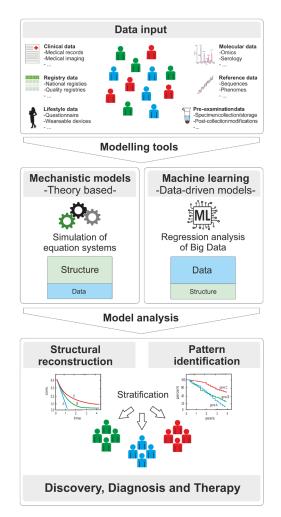
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## **Data-driven or theory-based**

- Mechanistic models: represent governing physiological processes: functional understanding of underlying mechanisms
- Data-driven (ML, DL, AI) aim for knowledge discovery, require large data sets and do not require prior functional understanding – pattern observation



J. Pers. Med. 2022, 12(2), 166; https://doi.org/10.3390/jpm12020166

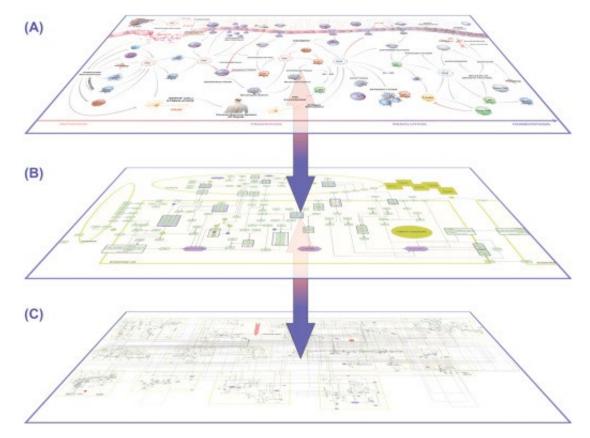




#### **Discovery through mechanistic models**

Example: MIM Molecular interaction map:

map on inflammation resolution provides functionality to visualize Omics data and allows making hypotheses on the role of connected molecules in a disease phenotype structure the growing knowledge of the field in a comprehensible manner.



Fujita, K.A., Ostaszewski, M., Matsuoka, Y. et al. Integrating Pathways of Parkinson's Disease in a Molecular Interaction Map. Mol Neurobiol 49, 88–102 (2014)





## Modelling Approaches for Clinical Applications in Personalized Medicine

#### Mechanistic Models

The aim of a mechanistic model is to functionally understand, examine, and predict the emergent properties of individual components of a biological system and the manner in which they are coupled.

Previously established concepts range from static molecular interaction maps and constraint based modelling to qualitative logic-based models to more detailed quantitative kinetic models. The choice of a model formalism depends on the availability of data, the type of research question and the size and structure of the system.

Molecular interaction maps (MIMs) are static models that depict the physical and causal interactions among biological species in the form of networks

#### **Constraint-Based Models**

Constraint-based models, such as GEnome-scale Metabolic models (GEM), provide a mathematical framework to gaining an understanding of metabolic capacities of a cell, enabling system-wide analysis of genetic perturbations, exploring metabolic diseases, and finding the essential enzymatic reactions as well as drug targets

#### **Boolean Models**

Boolean modelling (BM) is the simplest form of logic-based models where nodes (e.g., a gene, protein, a transcription factor, or microRNA, etc.) are described by one of two possible states

#### **Quantitative Models**

Quantitative modeling, such as the ordinary differential equations (ODEs)-based approach, quantitatively analyses the behavior of a biochemical reaction over time.

Pharmacokinetic models are a particular application of ODE models that describe the concentration of a drug in plasma or different tissues

#### Software Resources and Tools

In the following, we provide a list of widely used resources and tools for the construction, visualization, and simulation of MIMs, including qualitative and quantitative models and pharmacokinetic models



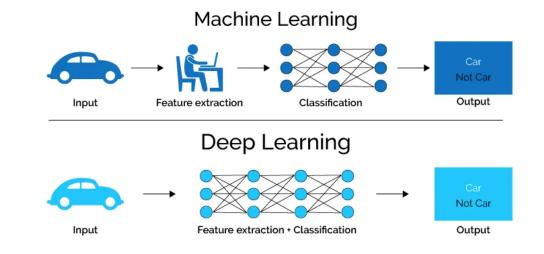


#### **Machine learning**

Data-driven approaches treat the causal mechanism as unknown and aim to model a function that operates on large-scale data input to predict the outcome, regardless of the unknown physiological processes.

'Machine learning' refers broadly to the process of fitting predictive models to data or of identifying informative groupings within data.

Machine learning is particularly useful when the dataset one wishes to analyse is too large (many individual data points) or too complex (contains a large number of features) for human analysis

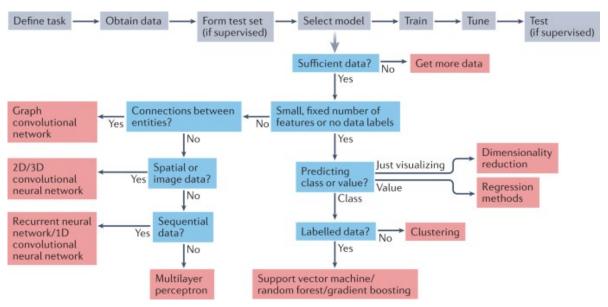






#### **Traditional machine learning**

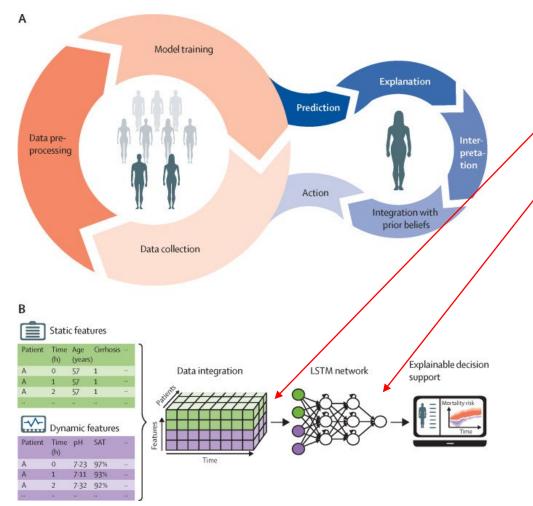
- Deep learning
- Artificial neural networks
- Supervised learning data is labelled
- Unsupervised patterns in unlabelled data
- Semi-supervised where labelled data are rare
- Classification, regression and clustering
- Traditional machine learning
- Deep learning
- · Artificial neural networks
- Supervised learning data is labelled
- Unsupervised patterns in unlabelled data
- Semi-supervised where labelled data are rare
- Classification, regression and clustering







# WP1-2 Workshop: Using patient derived data for in silico modelling in personalized medicine: Outcome - Focus of standardization for modelling



#### Standardization of model input (data) and model output / validation

#### modified from:

Dynamic and explainable machine learning prediction of mortality in patients in the intensive care unit: a retrospective study of highfrequency data in electronic patient records, Thorsen-Meyer, Brunak et al., Lancet Digital 2020





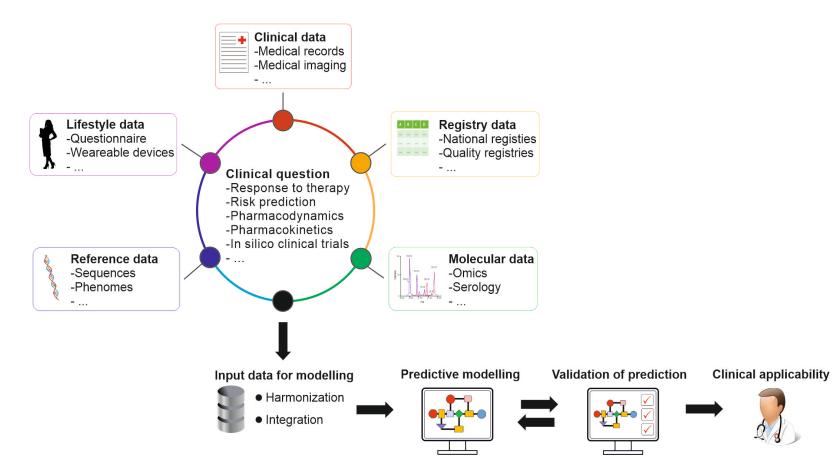
#### Review article: computational models for clinical applications in PM – Guidelines/recommendations - data integration - model validation

- > Most relevant computational models for PM
- > Best-practice guidelines
- > Complex heterogeneous data
- > Computational models functional understanding





#### Modelling workflow: from and to the clinic

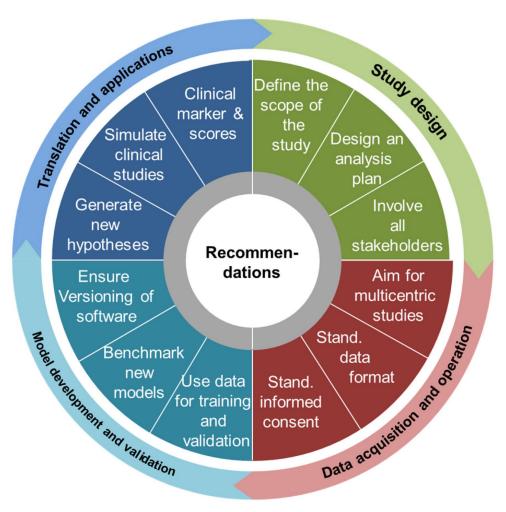


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#### **Recommendations**







#### Conclusions

There are many successful examples for the application of computational models in discovery, diagnosis, and therapy. However, several challenges remain to fully realize the possibilities of personalized data in clinical practice, in particular regarding data provision, model building, and model filing as well as legal issues and ethics.

#### To support successful study outcomes:

- > Careful planning of study design
- > Common standards for data sampling, data acquisition, and data operation
- > Data harmonization
- > Data should be divided for training and validation;
- > Model documentation should be written according to best practice guidelines;
- > It is important to openly communicate model assumptions and biases in the computational results;
- > New patient data should be continuously used for benchmarking of the computational results.





## Acknowledgements

# EU-STANDS4PM is funded by the European Union Horizon2020 framework programme of the European Commission, Directorate-General for Research and Innovation under Grant Agreement # 825843.





# A European standardization framework for data integration and data-driven *in-silico* models for personalised medicine

# WP3: Guidance on the legal, ethical and policy considerations arising from the use of in silico modelling for personalized medicine

Miranda Mourby OU, Eugenijus Gefenas, Vilma Lukaseviciene & Jurate Lekstutiene VU, Mette Hartlev & Katharina Ò Cathaoir UCPH,





#### AIM of WP3

Overall aim of WP3 is – in close collaboration with the other WPs:

- provide guidance on the legal, ethical and policy considerations arising from the use of in silico modelling for personalized medicine,
- identify and analyse legal and ethical issues
- ensure that recommendations for standardization are legally and ethically sound





#### WP3 team

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Mette Hartlev Copenhagen University Professor of Health Law, Chair of National Committee on Health Research Ethics Specialized in patients rights and law, science and technology studies





Katharina Ò Cathaoir Copenhagen University Assistant professor of Health Law,

Specialized in patients rights & health and human rights law



Eugenijus Gefenas Vilnius University *Professor* and director of the *Centre for Health Ethics, Law and History Chair of European network of research ethics committees* (EUREC)



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Jurate Lekstutiene Vilnius University Lecturer of Bioethics Specialized in clinical trials regulation







## Data integration for development of in silico models -Legal and ethical aspects

- Privacy and data protection regulation impact on data integration for the development of in silico models
- > Lead: Miranda Mourby
- Clinical trials and research ethics regulation – impact on data integration and development of in silico models
- Lead: Eugenijus Gefenas, Vilma Lukaseviciene & Jurate Lekstutiene
- Patients' rights impact on data integration for development and application of in silico models
- > Lead: Mette Hartlev and Katharina Ò Cathaoir





CHARTER OF FUNDAMENTAL RIGHTS OF THE EUROPEAN UNION





Biomedicine and human rights The Oviedo Convention and its additional protocols







#### **Deliverables**

- > D3.1: Report containing (i) a survey of the international and European data protection and clinical trials regulation as well as legal and ethical regulation relevant for protection of equal access to health, and right to information and self-determination relevant for harmonization and integration of data in in-silico modelling, and (ii) an assessment of the challenges and options this regulation provides for harmonization and integration of data in in-silico modelling. [M12]
- D3.2: Report outlining technically feasible and legally and ethically sustainable avenues for harmonization and integration of big data of relevance for personalized medicine into *in silico* modelling. [M30]
- D3.3: Report containing the final recommendations for legally and ethically sustainable transnational data harmonization, integration and *in silico* models for personalized medicine. [M40]





#### Legal fragmentation

"...while the GDPR is a much appreciated piece of legislation, variation in interpretation of the law and national level legislation linked to its implementation have led to a fragmented approach which makes cross-border cooperation for care provision, healthcare system administration or research difficult."



European Commission, DG Health and Food Safety, 'Assessment of the EU Member States' rules on health data in the light of the GDPR' 12 February 2021, available from:

'https://ec.europa.eu/health/sites/health/files/ehealth/ docs/ms\_rules\_health-data\_en.pdf'





## Main findings in first report

- Data protection regulation suffer from legal fragmentation
  - > National laws differ both within and beyond EU
  - Uncertainty regarding legal interpretations and application of GDPR and national laws on data sharing practises
- Uncertainty regarding role and interaction of GDPR consent (*informational consent*) and research ethics consent (*interventional consent*)
- Lack of awareness of the role of patients' rights in developing in silico models



Deliverable 3.1





#### Second report

Recommendations for technically feasible, and ethico-legal sustainable avenues harmonization and integration of big data of relevance for personalized medicine in in silico modelling







## Program – stakeholder workshop 19 April 2022

#### 10 am: Welcome and introduction to the workshop: (15 minutes)

#### 10.15: Data Protection & Technical Avenues for Data Integration (55 minutes)

- > Presentation: Miranda Mourby (15 minutes)
- > Expert Commentary: Catherine Bjerre Collin & Fruzsina Molnar-Gabor (10 minutes)
- Stakeholder Questions & Feedback (30 minutes)

#### 11.10: Interaction between research ethics guidelines and data protection regulation (55 minutes)

- > Presentation: Eugenijus Gefenas, Jurate Lekstutiene & Vilma Lukaseviciene (15 minutes)
- > Expert Commentary Barbara Prainsack & Dominique Sprumont (10 minutes)
- > Stakeholder feedback (30 minutes)

#### 12.05 Break (10 minutes)

#### 12.15: Rights of Patients & Research Subjects (50 minutes)

- > Presentation: Katharina Ó Cathaoir (10 minutes)
- > Expert Commentary Santa Slokenberga & Edward Dove (10 minutes)
- > Stakeholder Questions & Feedback (30 minutes)

#### 13.05: Wrapping up and way forward (10 minutes)

#### 13.15: Close





#### **Data Protection Conclusions**

- The GDPR = not a perfectly harmonised framework.
- Federated + synthetic data generation lessens personal data burden.
- BUT real patient data needed in some cases?
- Two EU initiatives of particular relevance:
  - Data Governance Act
  - European Health Data Space
- Questions remain, relevant to final recommendations...







## 1) Data Altruism Consent

#### Question: broad or granular consent?

## The European Commission will need to decide in designing their consent form.

Chapter IV facilitates data altruism (data voluntarily made available by individuals or companies for the common good). It establishes the possibility for organisations engaging in data altruism to register as a 'Data Altruism Organisation recognised in the EU' in order to increase trust in their operations. In addition, a common European data altruism consent form will be developed to lower the costs of collecting consent and to facilitate portability of the data (where the data to be made available is not held by the individual).





## 2) Data Cooperatives

- Potentially another way people can join together and 'donate' information.
- > BUT they still have to exercise their own data subject rights.
- Do we need something more radical to facilitate research? Are rights within genomic data too complex for us to negotiate individually?
- For example: subject access request for a personal genome??





## 3) Data Minimisation

Option	Privacy Risk	Utility
Synthetic Data	Least?	Hypothesis generation only?
Federated Data Access	Lower	Promising
Remote/ Cloud Based Access	Medium	Still necessary to 'see' data directly?
Contractual Access	Higher	Necessary to physical download/ transfer data for analytical purposes?

## Question: when is federated data querying insufficient for in silico modelling purposes?





## Changing understanding of consent rule in the context of health data research

- controversies between interpretation of consent rule in different normative frameworks:
- research ethics (Examples: WMA Declaration of Helsinki 2013; CIOMS Guidelines 2016; CoE Recommendation 2016):
- > Integrating **both**:
  - > **interventional** consent (consent to intervention very few exceptions)
  - informational consent (consent to process health data includes modalities and exceptions)
- protection of personal data (GDPR (2016), national data protection laws):
  - > Only informational consent





#### **Misconceptions and controversies**

## Informational vs interventional "consent misconception" for participants, RECs and others

> E.g., research participants can think that consent to participate in a research project also extends to the consent to process their personal data (Dove and Chen 2020) and therefore **mistakenly believe that s/he is still able to access the data, object to its further processing or erase it** 

#### **Controversies of informational consent**

- > two major areas of dispute:
  - > Broad consent
  - > Waiving of consent





# Informational consent controversy I: the use of broad consent (e.g., in the context of biobanks)

#### **Research ethics regulations**

 broad consent is explicitly allowed - future research use can be "...extending to a number of wholly or partially undefined studies" (CIOMS, guideline 11)

#### **Data protection regulations**

- Sets a very strict standard for IC - it must be "clear, concise, specific and granular, freely given and revocable", GDPR, Art.7
- consent to only "certain areas of scientific research" (GDPR, Recital 33):

# Which interpretation of broad consent is preferable in the context of biobanking?





# Informational consent controversy II: Waiving of consent (e.g., secondary research of data)

#### **Research ethics regulations**

- waiving of consent is justified only as an exception (Declaration of Helsinki, 2013) or
- only "where the attempt to contact the person concerned" has been made and proved to be unsuccessful (Council of Europe. Recommendation 2016).

#### **Data protection regulations**

- GDPR, Art. 6 provides a "research-friendly approach" (Shabani and Borry, 2018) as it does not give consent any predefined priority for health data processing, &
- Art. 9(2)(j) so-called 'research condition' allows an alternative to re-consent for the research use of previously collected health data and biological materials





# Implications for researchers, research institutions, RECs and DPOs

- divergent interpretation of key concepts, such as "broad consent", "public interest", applicability of "research condition" due to the institutional division:
  - Research Ethics Committees (RECs) mostly follow research ethics guidelines
  - Data protection bodies are primarily responsible for data protection issues in research following the GDPR
  - How should RECs and DPOs interact in the changing normative environment of health data research?





#### **Rights of patients and research subjects - why are they important?**

- Patients and research subjects are contributing with their date for the development of in silico models
- Clinical use of in silico models has an impact on patients and patient rights







## **Confidentiality and trust**

- What does confidentiality imply in a big data research environment?
- > Balancing of interests
  - > The individual v science and society?
- Confidence and trust in the health care services is also a societal interest
- How can confidence and trust be sustained?









#### **Transparancy**

- About the potential use of data including data sharing across borders and with private business
  - > When data are collected
- About the actual use of data for research or other purposes
  - > Opportunity to follow data
  - > Dynamic consent?
- When used for clinical purposes transparancy about the logic of AI-based clinical advise
  - > Explainability and patient right to information



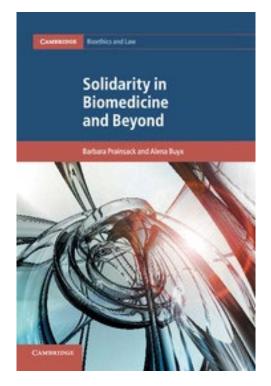




## A model for solidarity

Solidarity is enacted commitments to accept costs to assist others with whom a person/persons recognise similarity in a relevant respect Barbarba Prainsack and Alena Buyx, Solidarity in Biomedicine and Beyond

- Solidaristic practise always includes intentionality and decision-making
- Data and samples must be used in a way which creates social value
- Risk minimization



**Bias** 

FOR MEN **Fairness, diversity and non-discrimination** — Best possible efforts should be made to avoid unfair bias (e.g. stemming from the used data sets or the ways the AI is developed). AI systems should be user-centric and whenever relevant, designed to be usable by different types of end-users with different abilities. AI systems should avoid functional bias by offering the same level of functionality and benefits to end-users with different abilities, beliefs, preferences and interests, to the extent possible. Inclusion and diversity must be enabled during the entire life cycle of the AI system. Use diverse design teams and ensure participation of affected stakeholders to ensure objectivity and inclusiveness of the developed systems/approaches.

- Risk of bias is prevalent in Al-models > should be taken into consideration when developed to avoid discrimination
- Quality standards can facilitate the development of non-biased AI-models

ANDS/PM standards for in silico models for personalised medicine





'HELL YES'

AITLIN MORAL

THE SUNDAY TIMES BESTSELLER

INVISIBLE

WOMEN

WORLD

Eve-opening

CORDELIA FINE







### **Publications**

- Mette Hartlev, 'Health Disparities and New Health Technologies A Patients' and Human Rights Perspective', *European Journal of Health Law*, Vol 28 (2) (2020), p.142-164.
- Miranda Mourby, 'Leading by Science' through Covid-19: the GDPR & Automated Decision-Making', *International Journal of Population Data Science*, Vol 5 (4) (2020)
- Søren Brunak, Catherine Bjerre Collin, Katharina Eva Ó Cathaoir, Martin Golebiewski, Marc Kirschner, Ingrid Kockum, Heike Moser and Dagmar Waltemath, 'Towards standardization guidelines for *in silico* approaches in personalized medicine', *Journal of Integrative Bioinformatics,* Vol 17 (2-3) (2020)
- Miranda Mourby, Catherine Bjerre Colding and Katharina O Cathaoir, 'Explaining Machine-Learning in Healthcare – the GDPR and the *Montgomery* duty of disclosure', *Computer Law and Security Review*, vol 43 (2021)
- Eugenijus Gefenas, Jurate Lekstutieni, Vilma Lukaseviciene, Mette Hartlev, Miranda Mourby and Katharina Ó Cathaoir, 'Controversies between regulations of research ethics and protection of personal data: informed consent at a cross-road', *Journal of Medicine, Health Care and Philosophy,* Vol 25 (1) (2022), p. 23-30





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## A European standardization framework for data integration and data-driven *in-silico* models for personalised medicine

#### WP3: Innovative data governance for collaborative research projects: A new harmonized data access agreement for controlled access data

Stephan Beck, UCL s.beck@ucl.ac.uk





#### Background

#### Bermuda Agreement (1996)

Immediate **open access** release to accelerate research and prevent privileged exploitation of human DNA sequence



#### **Sir John Sulston**

1942 - 2018

"His dedication to free access to scientific information was the basis of the open access movement and helped ensure that the reference human genome sequence was published openly for the benefit of all humanity"

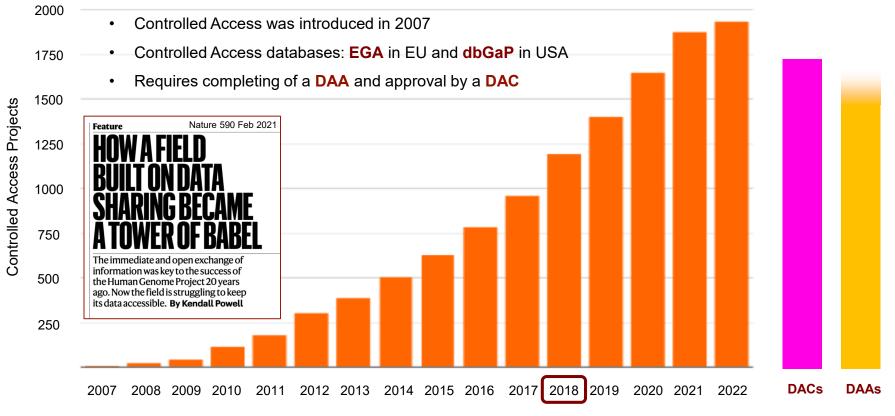
Jeremy Farrar, Wellcome Trust







#### **Controlled Access**



#### Source:

- 1932 CAPs (Controlled Access Projects, Apr 2022) http://www.ncbi.nlm.nih.gov/projects/gap/cgi-bin/summary.cgi?
- 1723 DACs (Data Access Committees, Sep 2021) https://www.ebi.ac.uk/ega/dacs
- 1500+ DAAs (Data Access Agreements, Sep 2021) estimate, no official statistics

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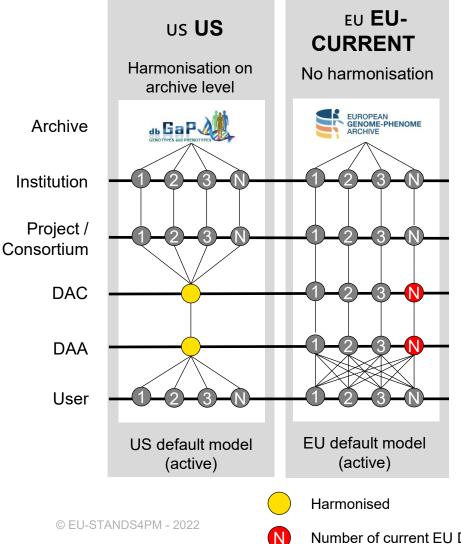
#### Need for harmonisation







#### **Controlled Access Models**



- Harmonised Data Access Agreement
- GDPR compliant
- Wide consultation involving 17 projects
  - (10 EU and 7 non-EU) and an

international stakeholder workshop

Onboarding of EGA and

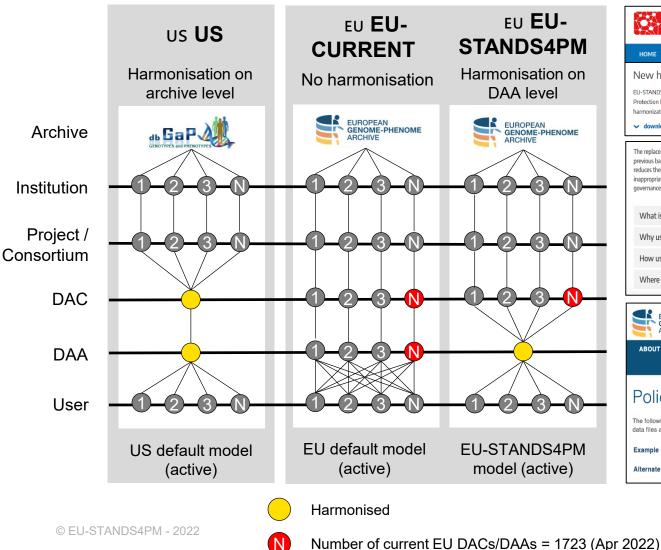
other stakeholders







#### **Controlled Access Models**





EU-STANDS PM standards for in silico models for personalised medicine			
HOME ABOUT BACKGROUND EVENTS INTRANET PUBLICATIONS			
New harmonized Data Access Agreement (hDAA) EU-STANDS4PM rolled out a standardized Data Access Agreement that is fully compatible with the EU General D Protection Regulation. This new harmonized Data Access Agreement for Controlled Access Data (hDAA) aims at a harmonization of data across collaborative research projects and improves data governance and flexibility. ✓ download hDAA https://www.eu-stands4pm.eu/data_access	better		
The replacement of the diverse Data Access Agreements (DAAs) by a single approved harmonized DAA (hDAA) can remove previous barriers to access and sharing of controlled access data (deposited in specific archives). The proposed new hDAA reduces the bureaucracy for both, data access committees (DACs) and prospective data users, and by removing inappropriate clauses present in many DAAs. Hence, the new hDAA for controlled access data is aiming at better governance and flexibility.			
What is it?	+		
Why use it?	+		
How use it?	+		
Where get it?	+		
ABOUT SUBMISSION BROWSE ACCESS DOWNLOAD METADATA			
Helpdesk Lo Policy documentation The following policy documentation is required to be prepared and submitted to the EGA, together with data files and associated metadata. Example DAA template	ng in		





## Implementation & uptake of hDAA

#### Implemented at EGA since October 2020

#### Included in 2022 ERA-PerMed call

https://erapermed.isciii.es/joint-calls/joint-transnational-call-2022/

#### Used by 3 out of the 17 targeted projects (all non-EU)

#### EpiMatch: EGAS00001006033 EPIC data (N=576)

https://www.ucl.ac.uk/cancer/research/centres-and-networks/blood-and-transplant-research-unit/research/improving-donor-selection

**EpiHK:** EGAD00001005486 IHEC reference epigenomes (N=19) https://epihk.org/

#### **BCP-ALL:** EGAS00001004407 WGS (N=1007), RNA-seq (N=1186) and EPIC data (N=32) https://www.nature.com/articles/s43018-021-00219-3





### **Next steps**

- Onboard federated EGA nodes (how?)
- For how long will hDAA/DAC-based data access be relevant before the field moves to federated access?
- Publication of a paper describing the hDAA





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