#### Summary WG3 Data Generation & Simulations

# WG Members

#### **19 members present on workshop:**

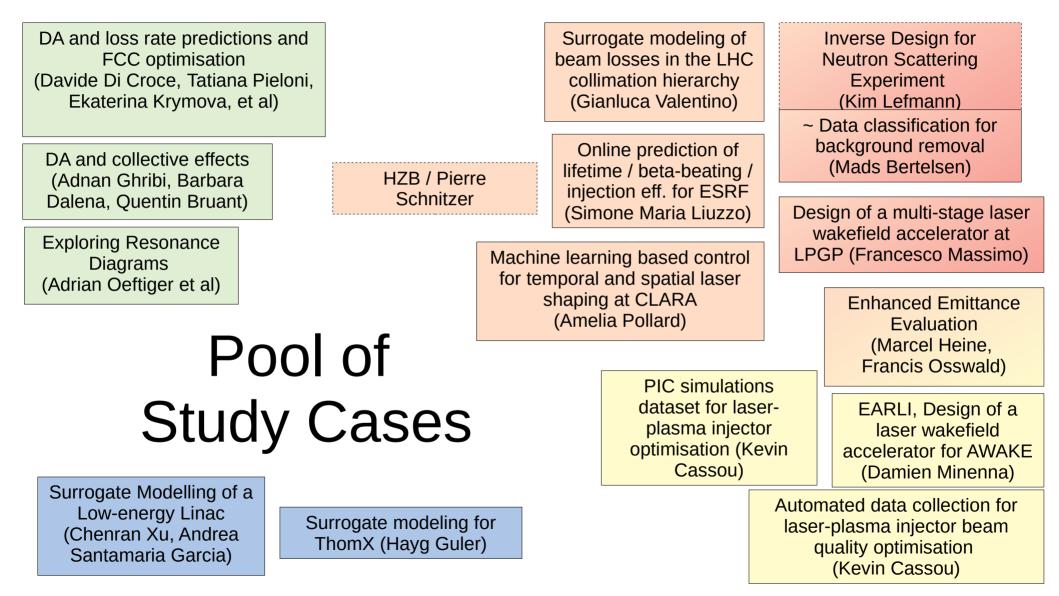
- Adrian Oeftiger (GSI/FAIR)
- Adnan Ghribi (CEA/CNRS)
- Amelia Pollard (ASTEC/STFC)
- Andrea Santamaria Garcia (KIT)
- Barbara Dalena (CEA/IRFU)
- Chenran Xu (KIT)
- Damien Minenna (CNRS)
- Davide Di Croce (EPFL)
- Francesco Massimo (UPS)
- Francis Osswald (CNRS/IPHC)

#### **Topics covered:**

- Accelerator physics
- Accelerator technology
- Linacs / Rings

- Gianluca Valentino (UM)
- Hayg Guler (CNRS/IJCLab)
- Kevin Cassou (CNRS)
- Mads Bertelsen (ESS)
- Marcel Heine (CNRS/IPHC)
- Pierre Schnizer (HZB)
- Simon Hirlaender (PLUS)
- Simone Liuzzo (ESRF)
- Thomas Kachelhoffer (CCIN2P3)

- Hadron beams / light sources
- Plasma WF accelerators
- Neutron scattering



# White Paper to Shape Ideas

- Data: bottom-up strategy for WG
  - Compare data management solutions: existing repos, EOSC projects (e.g. ESCAPE DIOS/OSSR)
  - Build on existing infrastructure and devise data publication workflow
- Pool: 14 study cases (+1)
- Investigate methods for active learning (=iterative supervised learning)
- Finalise & publish ~October '23

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#### Deliverables

- Standardising data:
  - Data: models & structure
  - Standardisation of metadata
  - Strategise data publication workflow
- · Developed translation tool that curates and structures data
  - $\rightarrow$  produce F.A.I.R. data (potentially published with DOI) to enable further data-driven processing
- Generated F.A.I.R. data sets
- Developed framework for simulations:
  - Input generation: clever parameter sampling ([uncertainty-aware] active learning algorithms)
    - Improve on grid search & random search!
  - Interpreter: input parameters  $\rightarrow$  simulation codes
  - Include translation tool (simulation code  $\rightarrow$  metadata compatible)
  - potentially: cluster job allocation management
  - potentially: exploit trained surrogate (with uncertainty measure) to re-use data/information

# Approach

- Regular hackathon-style events, per event:
  - Prepare 1-3 study cases as boiled down projects
  - Implement active learning strategies, compare effectiveness/energy-efficiency
  - Generate data sets, compare data management / publication solutions
  - Develop standardised set of metadata

# Impact

- #scientific publications / data catalogues
- #codes using the defined data standard
- Reduction of #data & speed-up factor required to reach conclusion in study
- Energy consumption & footprint (storage, computing)
- Geographical spread of (framework/data catalogue) end users
- Training/formation: #people and #data challenges (hackathon events)
- Knowledge transfer & validation across institutes
- Framework applicable to use cases in wider community (extensibility/plugins)

### Draft Structure for WP (to be synced)

|   |                   |                           | ſ      | Collecting inputs from the community for data/metadata standardisation |          |                           |   |   |
|---|-------------------|---------------------------|--------|--|----------|---------------------------|---|---|
|   | ~                 | Data collection           | Į      | Data generation for surrogate models                                   |          |                           |   |   |
|   |                   |                           | l      | Inkind<br>Beam studies data  | )        | Implementation            | { | Implementation of the developed tool for<br>data curation/structuration |
|   |                   |                           |        | Industrial partnership/development                                     |          |                           | ι | Implementation of an interpreter layer to speed up tracking simulations |
|   |                   | Development of methods    | {<br>{ | Development of data curation and structuration methods                 |          | Dissemination             | { | Publication of a community wide standard for data and metadata          |
|   |                   |                           |        | Exploration of methods for fast/frugal simulations                     |          |                           |   | Publication of FAIR data catalogues                                     |
|   |                   |                           | í      | Industrial partnership/development                                     | )        | Training                  | { | Regular hackathon style envents   |
|   |                   | Development of tools      | {<br>{ | Development of a tool for curation and data structuration              | •        | Industrial applications   |   |   |
|   |                   |                           |        | Development of an interpreter layer to speed up tracking simulations   |          | Coordination & Management |   |   |
| ٦ |                   | Prototyping/demonstrators | ſ      | Prototyping of a tool for curation and data structuration              | ) (<br>) | Communication             |   |   |
|   | $\left\{ \right.$ |                           | ι      | Prototyping of an interpreter layer to speed up tracking simulations   |          |                           |   |   |

Data/Simulation working group workpackages and tasks breakdown

#### Resources

- FTE on data/metadata collection
- Long-term support of simulation-embedding framework (in-kind, FTE)
- FTE or industry partnership (e.g. software companies on MLops / DEVops)
- Beam time (in-kind)
- Infrastructure for data storage & computing
- Commitment from research infrastructure (data stewards/officers)
- statistics/ML experts (from universities/industry)

#### Next Steps

- Add workshop outcome to white paper
- Conclude on Tasks & roles of WG members
- Synchronise WP structure with other WGs
- Build industrial partnerships



# **Collected Expected Results**

- Several methods of active learning / smart data exploration
- Online dynamic exploration of published results
- New tools to design (LWFA and classical accelerators, neutron scatt. exp.) front-to-end  $\Longrightarrow$  inverse design
- Interfacing tools between codes modelling different physics (at a given fidelity/precision)
- Data sets (to train AI & obtained surrogates during active learning)
- Surrogate models for large machines (present & future)  $\rightarrow$  with aim to embed in optimisation/classification problems
- Synthetic data for precise surrogate-optimisation purposes (data augmentation)
- Enhanced diagnostic (background removal)
- Implemented & shared framework managing (i) clever parameter generation, (ii) cluster job allocation, (iii) data postprocessing (implementing agreed data standards)
- Knowledge transfer & validation across institutes
- Metadata catalogue
- Have produced a F.A.I.R. & reused data set (citations of DOI, need to establish "impact factor of shared data")