

Federated Learning Simulation Engine

Borja Arroyo Galende (UPM), Juan Mata Naranjo (Cineca)

borja.arroyog@upm.es, j.matanaranjo@cineca.it

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Ludwigsburg, Germany

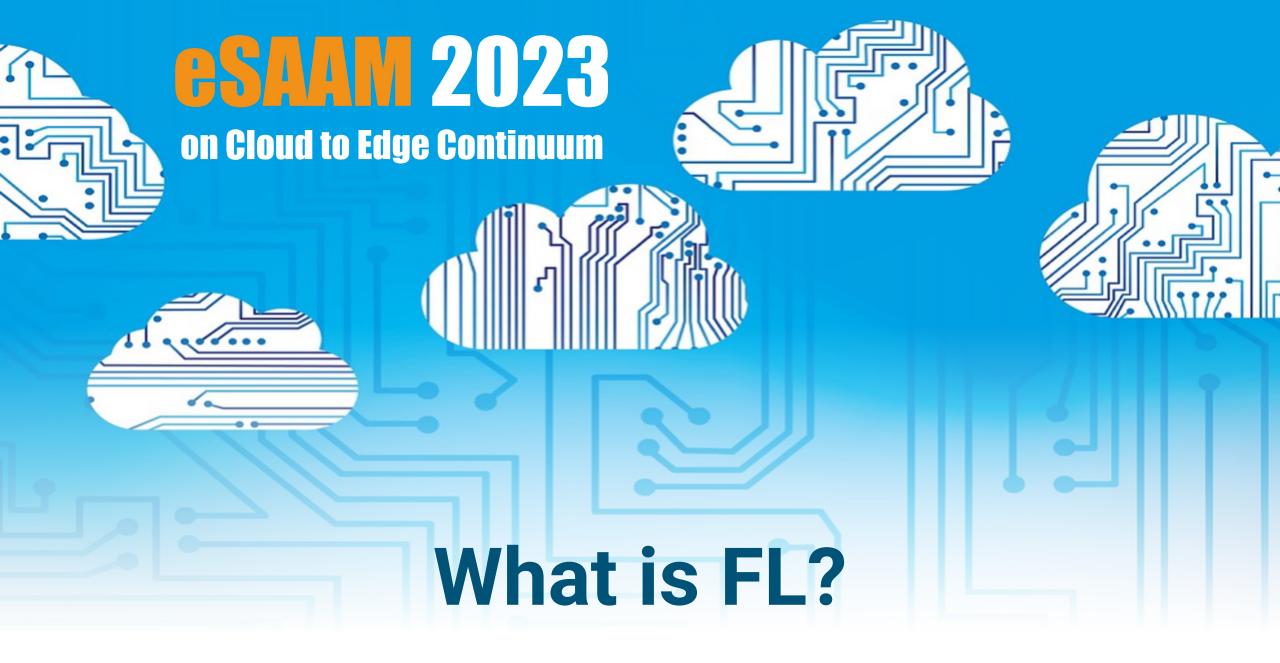








- What is federated learning (FL)?
- How does FL work?
- Why FL?
- Proposed simulation tool
- Conclusions

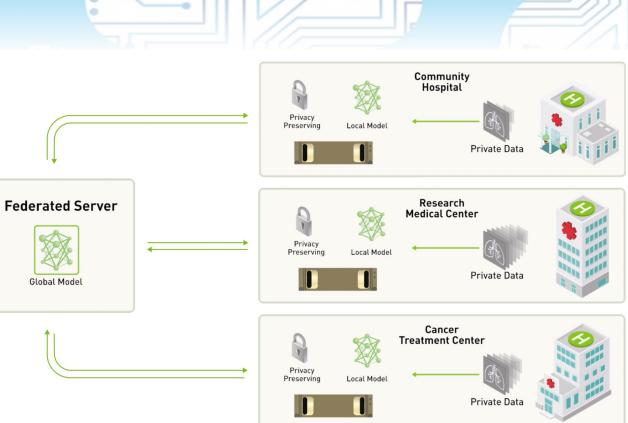




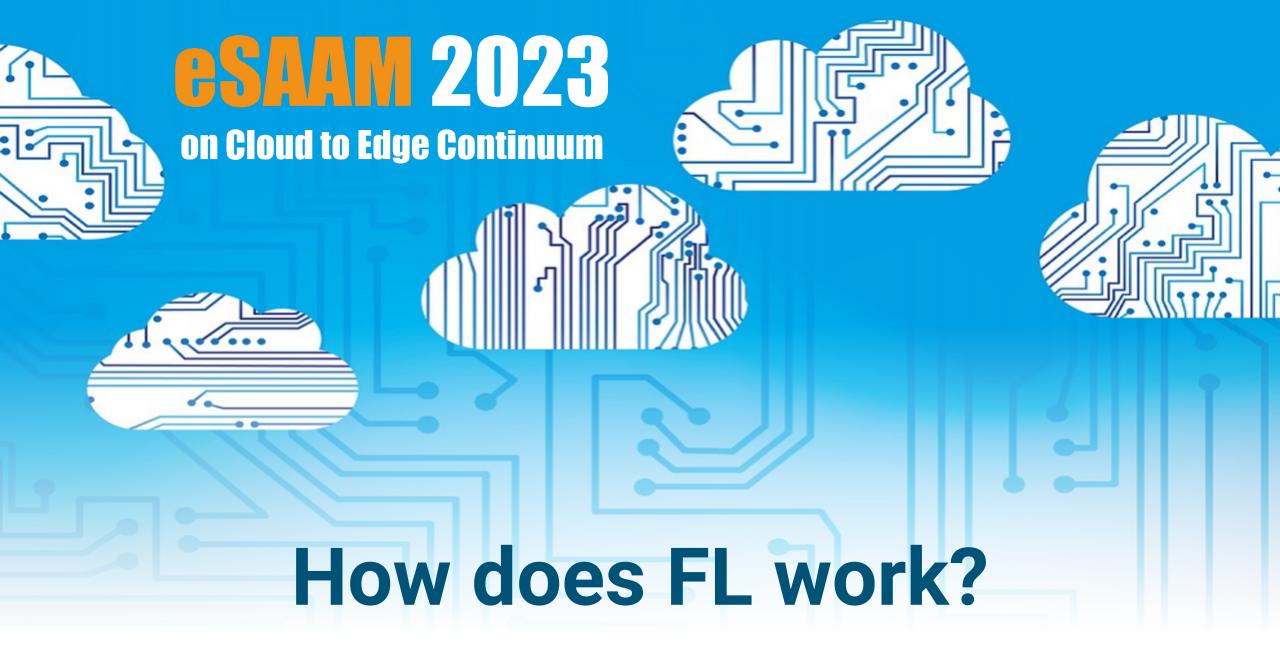




- Is a learning algorithm that allows to train models on decentralized data.
- Allows to train models without the exchange of private data.
- Involves two different entities:
 - Central node stores the global model and acts as aggregator.
 - Data nodes store local copies of the global model: local learners.



Nvidia blog: What is federated learning?







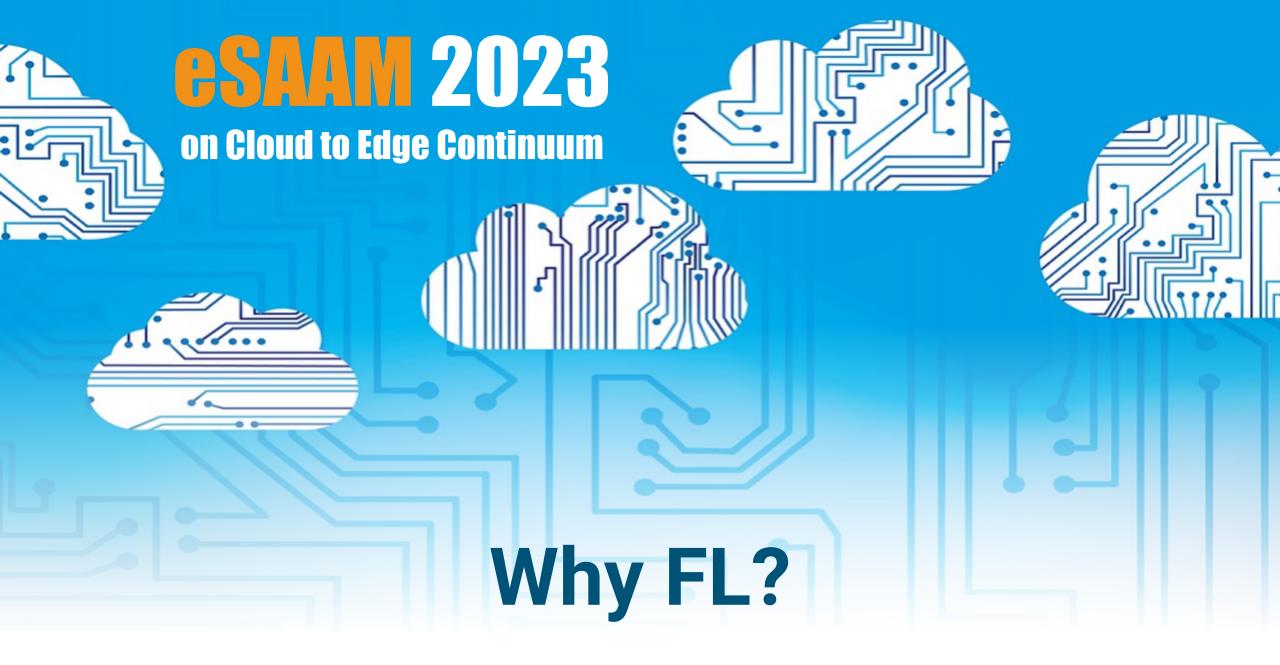
esaam 2023 on Cloud to Edge Continuum

Runs iteratively such that:

- 1. The local learners get trained on local data.
- 2. The aggregator combines the updates received from all data nodes and broadcasts a new version of the global model.

Step 1	Step 2	Step 3	Step 4
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Central server chooses a statistical model to be trained	Central server transmits the initial model to several nodes	Nodes train the model locally with their own data	Central server pools model results and generate one global mode without accessing any data

Wikipedia: Federated learning



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Slide #3.1





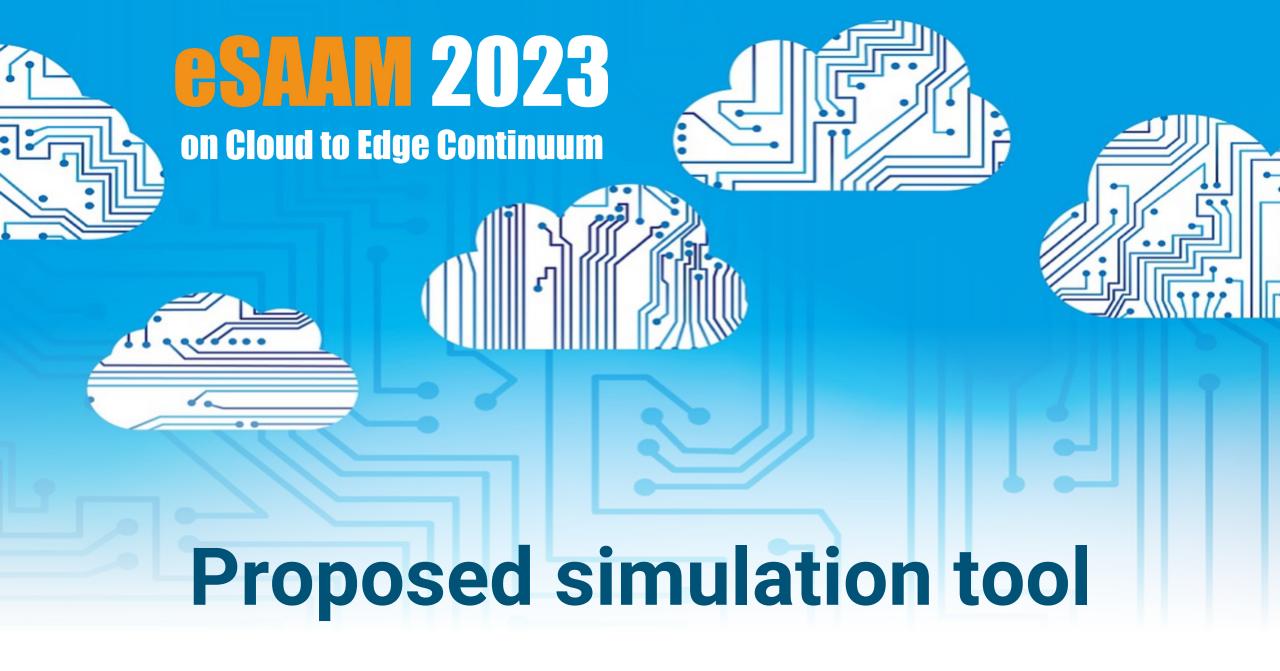
- Complies with data protection regulations regarding sensitive data.
- Supports novel approaches → Deep Learning.
- Can leverage on further privacy mechanisms. E.g. SMPC and DP

Slide #3.2





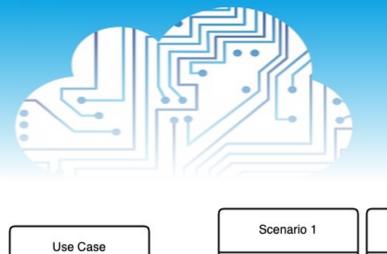
- Complies with data protection regulations regarding sensitive data.
- Supports novel approaches → Deep Learning.
- Can leverage on further privacy mechanisms. E.g. SMPC and DP
- But it comes with a cost:
 - Leap in complexity w.r.t. traditional ML.
 - In general, humble hardware resources in data nodes. E.g. phones.
 - Unpredictable behaviour in production scenarios.



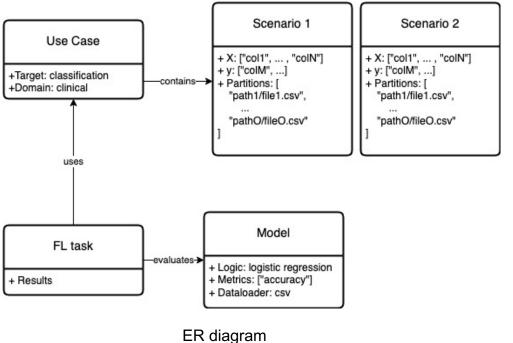


Features:

- Allows for the definition of use cases
- These use cases can be defined by the end user
- They consist of a set of scenarios
- A model can be simulated over meaningful data for a specific task
- FLOps → level 2 of maturity. Automatic training and evaluation + <u>automatic</u> verification of the models



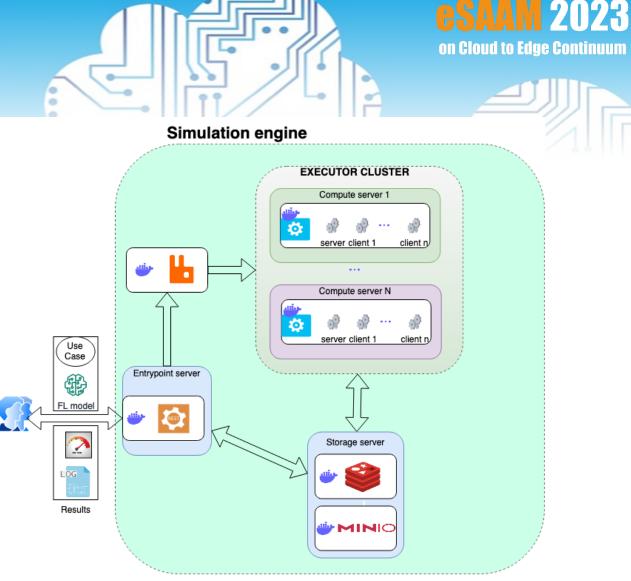




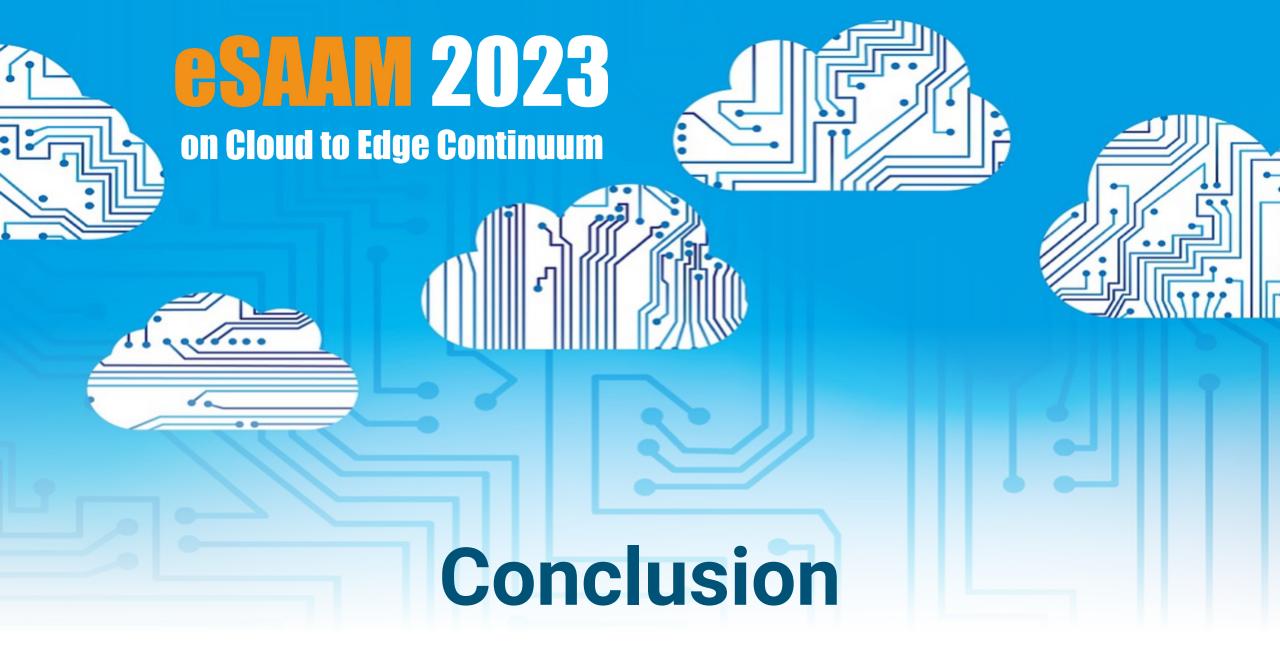


Benefits:

- Validate that a FL model runs error free prior to production scenario
- Optimizes resources usage in the production environment
- Gives a sense of the performance of the FL model over use cases
- Runs on a multicontainer setup



Architecture diagram



Slide #5.1





- Offers a tool that can be used both standalone or embedded within a larger architecture, it can be deployed anywhere and allows for concurrent, scalable, and highly available V&V assessment support for FL models
- Supports AI practitioners in the process of integrating FL driven model designs and to grasp model performance prior to production scenarios, allowing for a boost in trustworthiness towards ethical AI

