

# Federated Machine Learning

- Maria Aróstegi

## Perfil



Maria **Arostegi**, acabó su licenciatura en **Matemáticas** (especialidad en Teoría de Números) en 1995 en la EHU-UPV (Universidad del País Vasco), después de cursar su último año en Milán (Italia), en L'Universtità degli Studi di Milano.

En 1999 tuvo una beca de la diputación para trabajar 1 año en Iowa State University con **Carolina Cruz-Neira**, en temas de **VR**. Después de su Vuelta trabajó en varios proyectos relacionados con herramientas de modelización 3D, interacción gráfica, computación y simulación en escenarios virtuales.

Especializándose finalmente en el desarrollo matemático de las ecuaciones 3D de transferencia de calor en procesos **siderúrgicos**, y los factores de forma de las mismas.

En 2017, cambió su campo de investigación para centrarse en algoritmos matemáticos de **análítica de datos**, Machine Learning, y tecnologías Big data (como Hadoop, Spark, etc..), cursando para ello un **master** online en **“Big data, Business Intelligence, y Data Science”**. Actualmente se encuentra desarrollando un doctorado en: **Incremental Explainable ML**.

## Últimas publicaciones:

- **“A heuristic approach to the multicriteria design of IaaS cloud infrastructures for Big Data applications”**. *Maria Arostegi, Ana-Isabel Torre-Bastida, Nekane Bilbao, Javier Del Ser*. January 2018. Expert Systems DOI 10.1111/exsy.12259
- **“Concept Tracking and Adaptation for Drifting Data Streams under Extreme Verification Latency”**. *Maria Arostegi Ana-Isabel Torre-Bastida Jesús López Lobo, Nekane Bilbao, Javier Del Ser*. September 2018 Studies in Computational Intelligence DOI: [10.1007/978-3-319-99626-4\\_2](https://doi.org/10.1007/978-3-319-99626-4_2) In book: Intelligent Distributed Computing XII
- **“SLAYER: A Semi-supervised Learning Approach for Drifting Data Streams under Extreme Verification Latency”**, *Maria Arostegi, Jesús Lopez Lobo and Javier del Ser*. Proceedings of the “Workshop Interactive Adaptive Learning Bilbao September 2021. IAL2021. <https://www.activeml.net/ial2021/pdf/ialatecm12021.pdf>
- **“Machine Learning based Soft Sensing Tool for the Prediction of Leaf Wetness Duration in Precision Agriculture”**, *Maria Arostegi, Diana Manjarrés, Sonia Bilbao and Javier del Ser*. Proceedings of the “16th International Conference on Soft Computing Models in Industrial and Environmental Applications”, Bilbao September 2021. SOCO21. Publication Springer Nature [https://doi.org/10.1007/978-3-030-87869-6\\_50](https://doi.org/10.1007/978-3-030-87869-6_50)
- **“Edge intelligence secure frameworks: Current state and future challenges”** *Esther Villar, Maria Arostegi, Ana-Isabel Torre-Bastida, Cristina Regueiro, Juan Lopez de Armentia* August 2022. UNDER REVIEW Computers & Security

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- 2. What is federated learning?*
- 3. Use Cases*

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# *Why do we need federated learning?*



# Data is born at the edge

Billions of phones & IoT devices constantly generate data  
Data enables better products and smarter models



## Can data live at the edge?

Data processing is moving on device:

- Improved latency
- Works offline
- Better battery life
- Privacy advantages

E.g., on-device inference for mobile keyboards and cameras.



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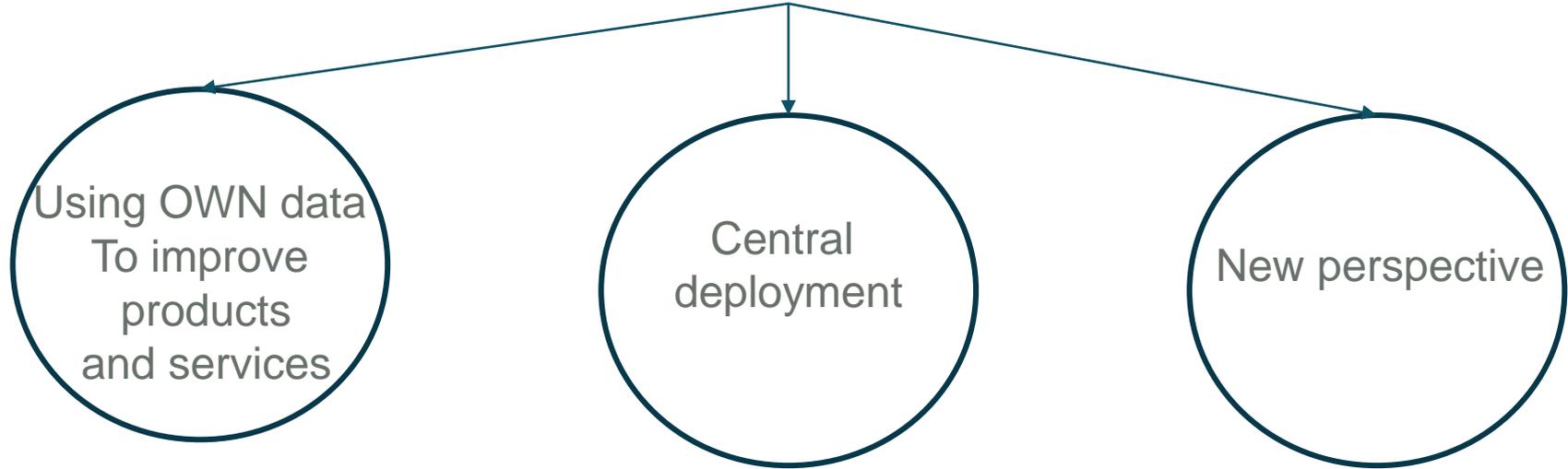
- Improved latency
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But when **computing** any **learning** process?

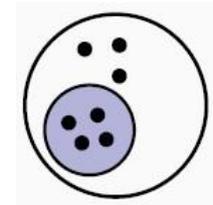
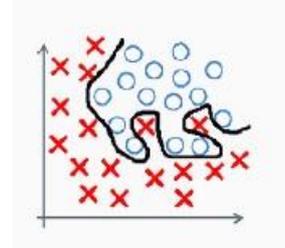
## Three options

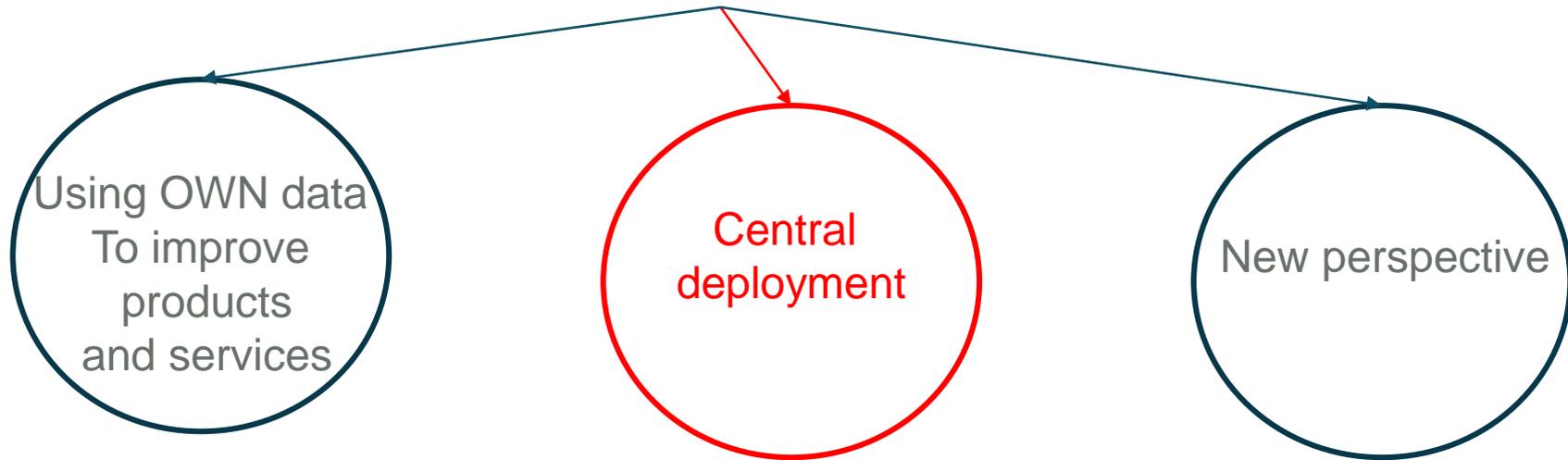


## Using OWN data

HOW ABOUT EACH PARTY LEARNING ON ITS OWN?

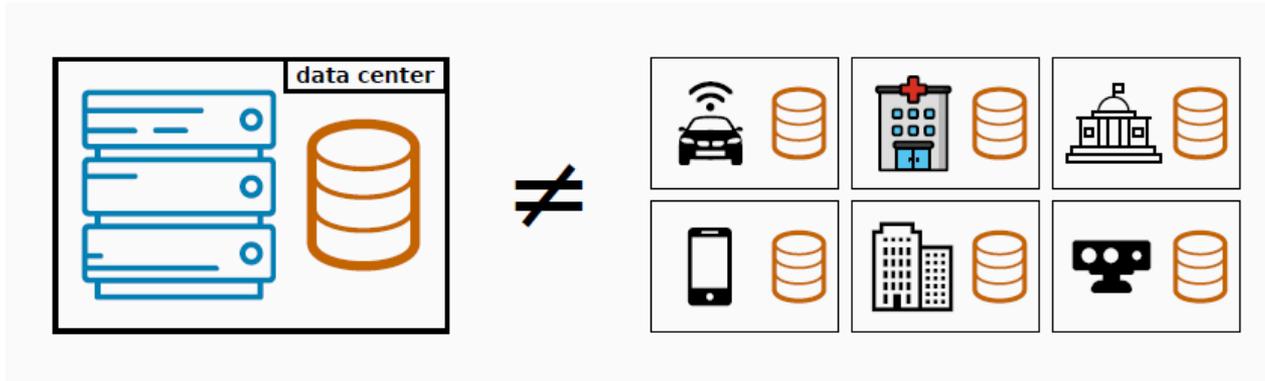
1. The local dataset may be **too small**
2. The local dataset may be **biased**

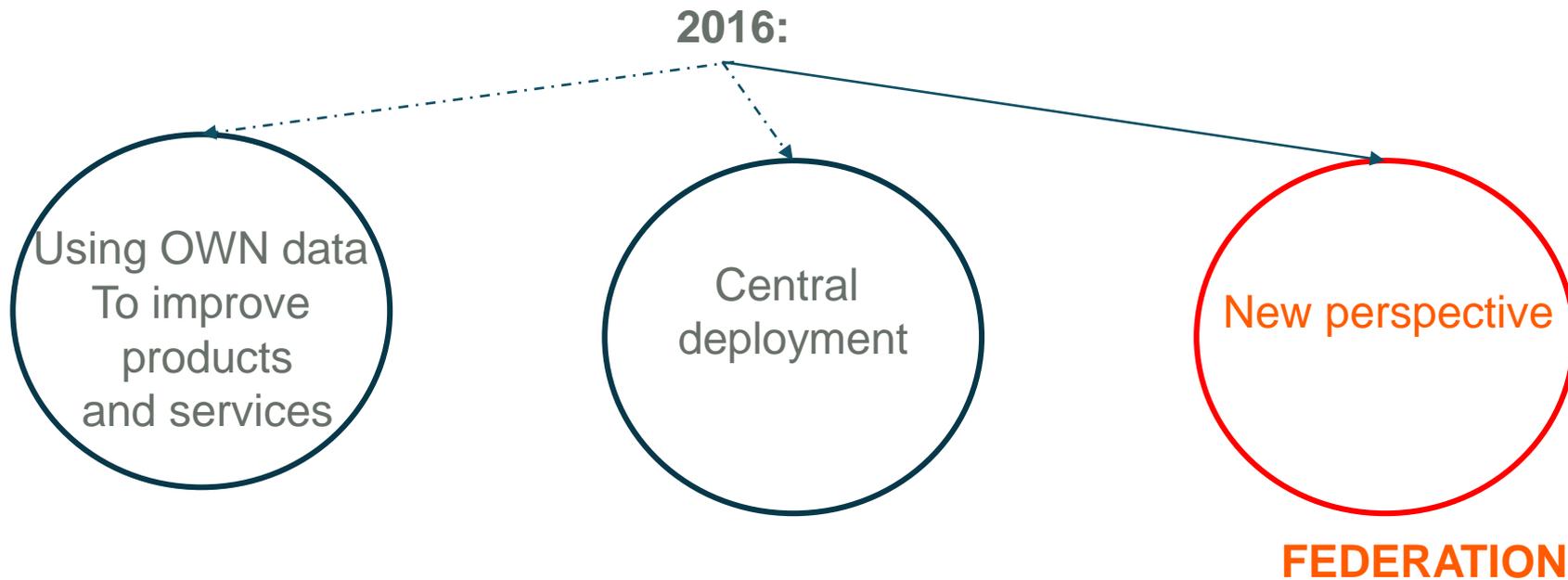


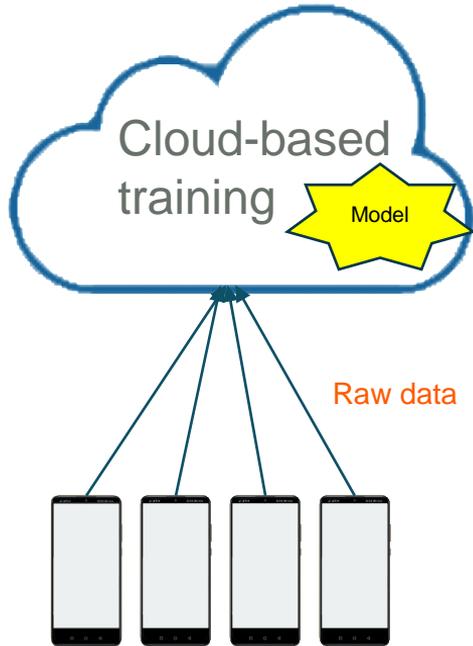


## FROM CENTRALIZED TO DECENTRALIZED DATA

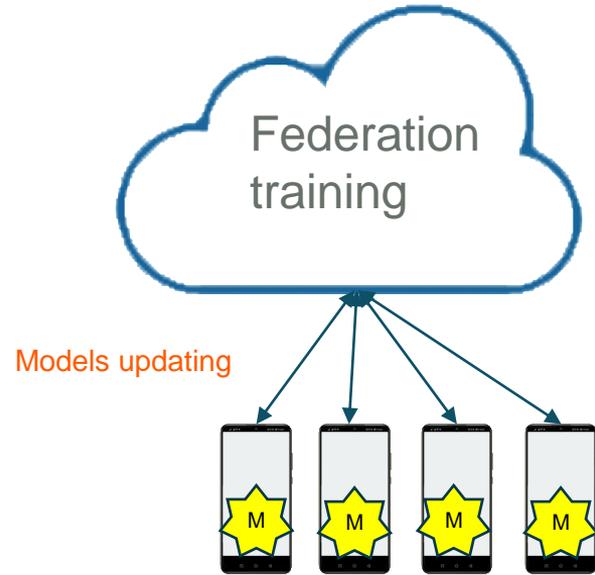
- The standard setting in Machine Learning (ML) considers a **centralized dataset processed in a tightly integrated system**
- But in the real world **data is often decentralized across many parties**







# WHY?





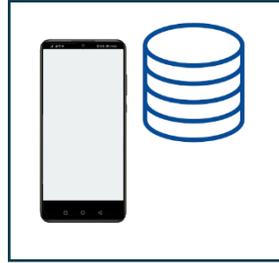
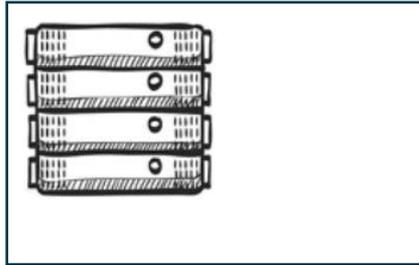
# 02

## *What is federated learning?*



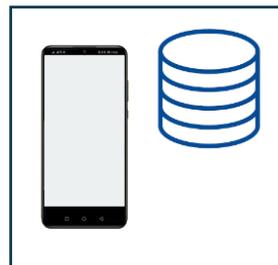
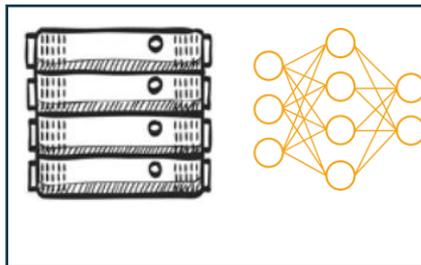
# 1- Federated Training

Federated Learning (FL) aims to collaboratively **train** a ML model while keeping the data decentralized

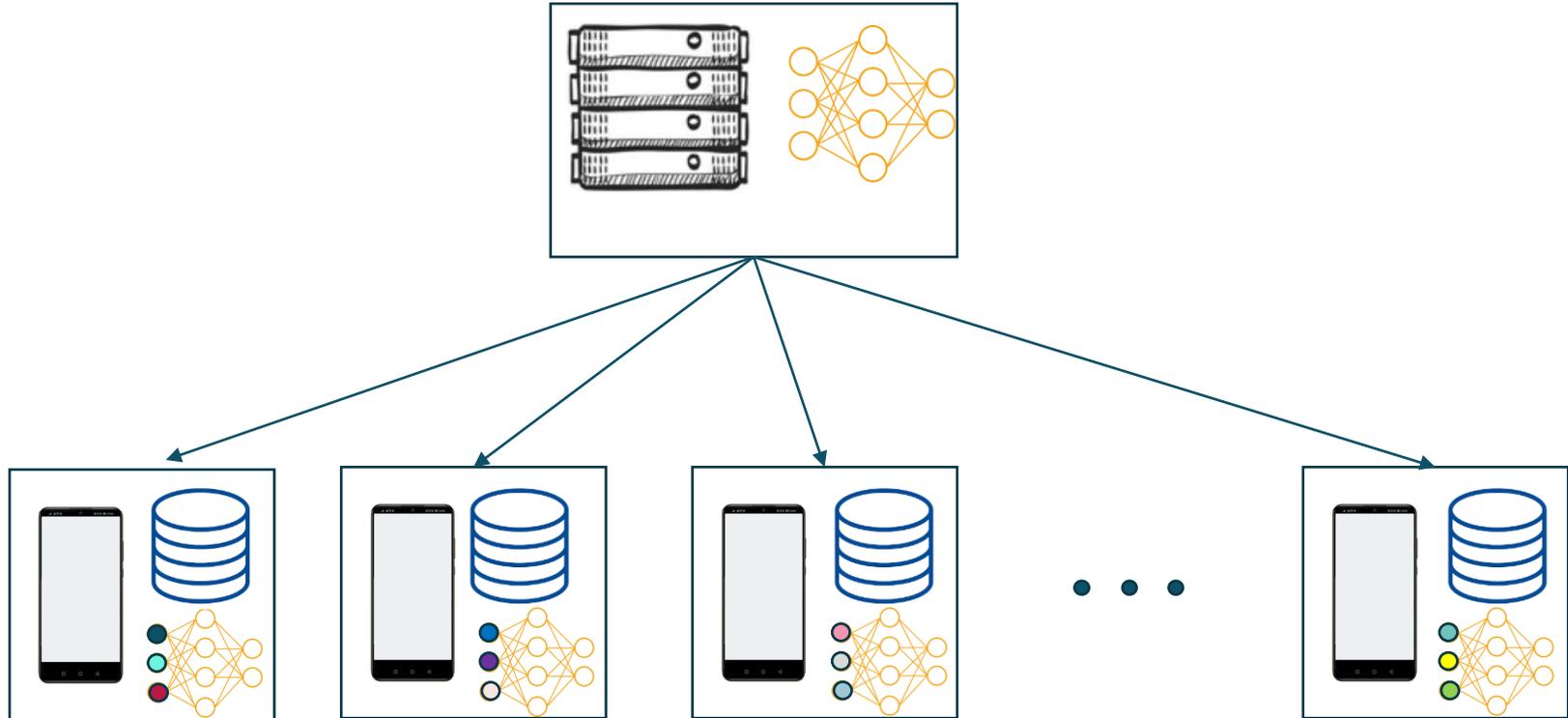


# 1- Federated Training

Initialize model



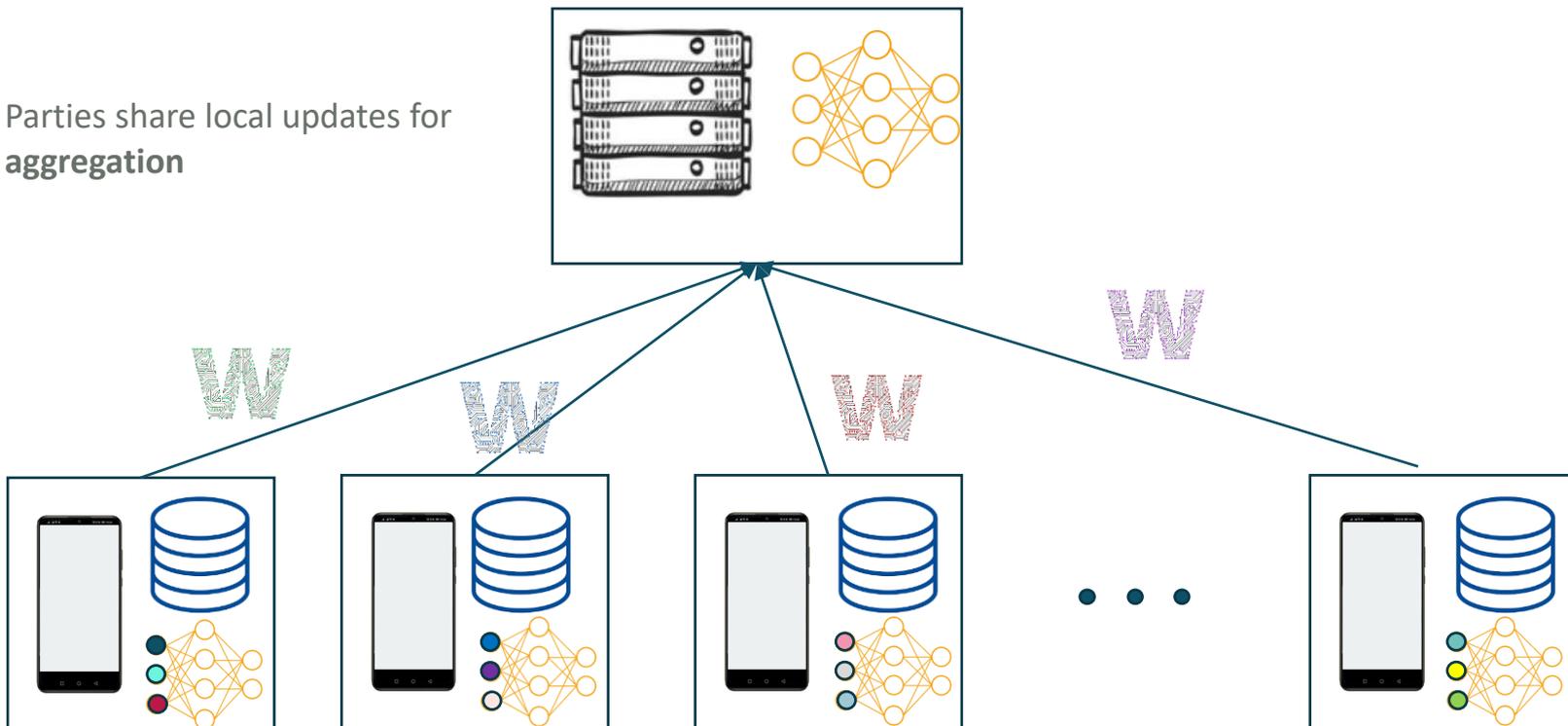
# 1- Federated Training



Each party makes an update using its **local** dataset: **FEDERATED TRAINING**

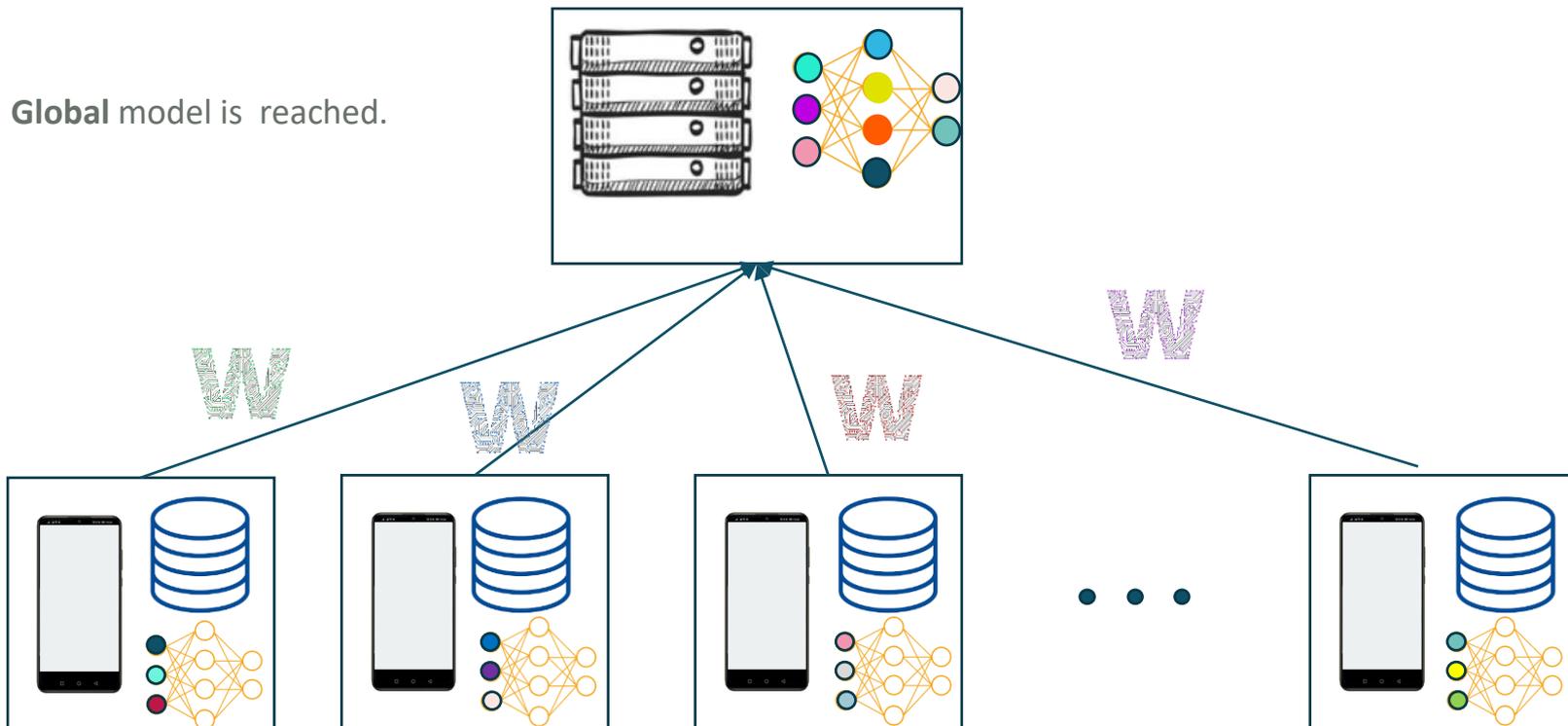
# 1- Federated Training

Parties share local updates for  
**aggregation**



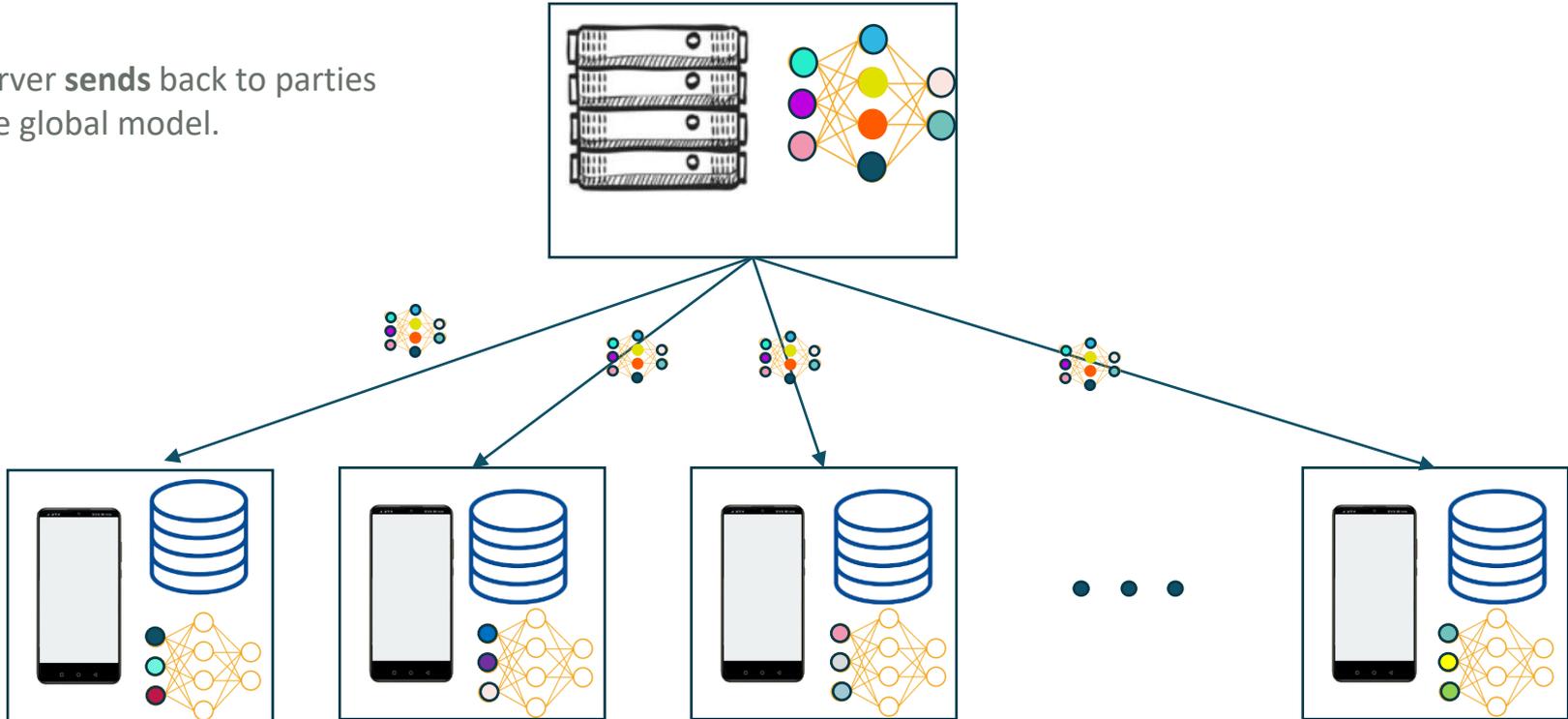
# 1- Federated Training

Global model is reached.



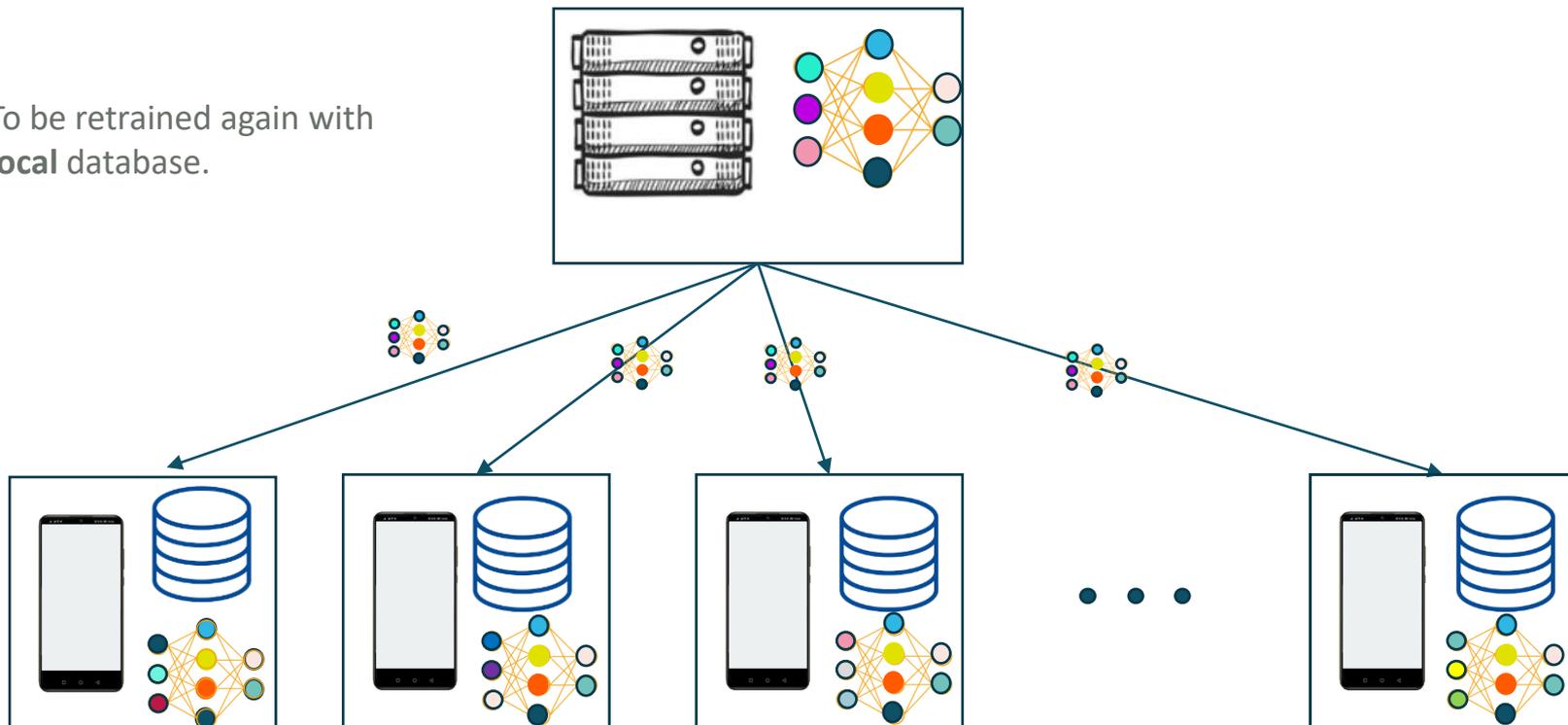
# 1- Federated Training

Server **sends** back to parties  
the global model.



# 1- Federated Training

To be retrained again with  
**local** database.





# 03

## *Use cases*



# Projects & Frameworks

## Terminet

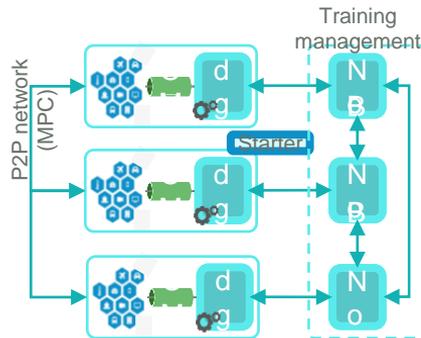
Provide a set of innovative mechanisms and tools for moving AI to the edge by using cutting-edge ML technologies, avoiding data collection and offering decentralized analytics, privacy by design and data protection.



## Decentralized

### Federated Training (Offline)

- FL Orchestration : Blockchain clients
- FL Model Aggregation : MPC
- FL Local Training : all the edges (clients)

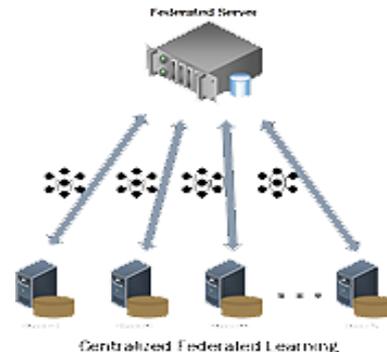


## Shinefleet



- Para el desarrollo de **soluciones tecnológicas de hidrógeno** para la movilidad inteligente y sostenible de flotas pesadas.
- Durante los próximos años, los participantes abordarán los principales ámbitos de investigación relacionados con **la generación de hidrógeno de manera descentralizada**, para su uso en el transporte de mercancías en camión.

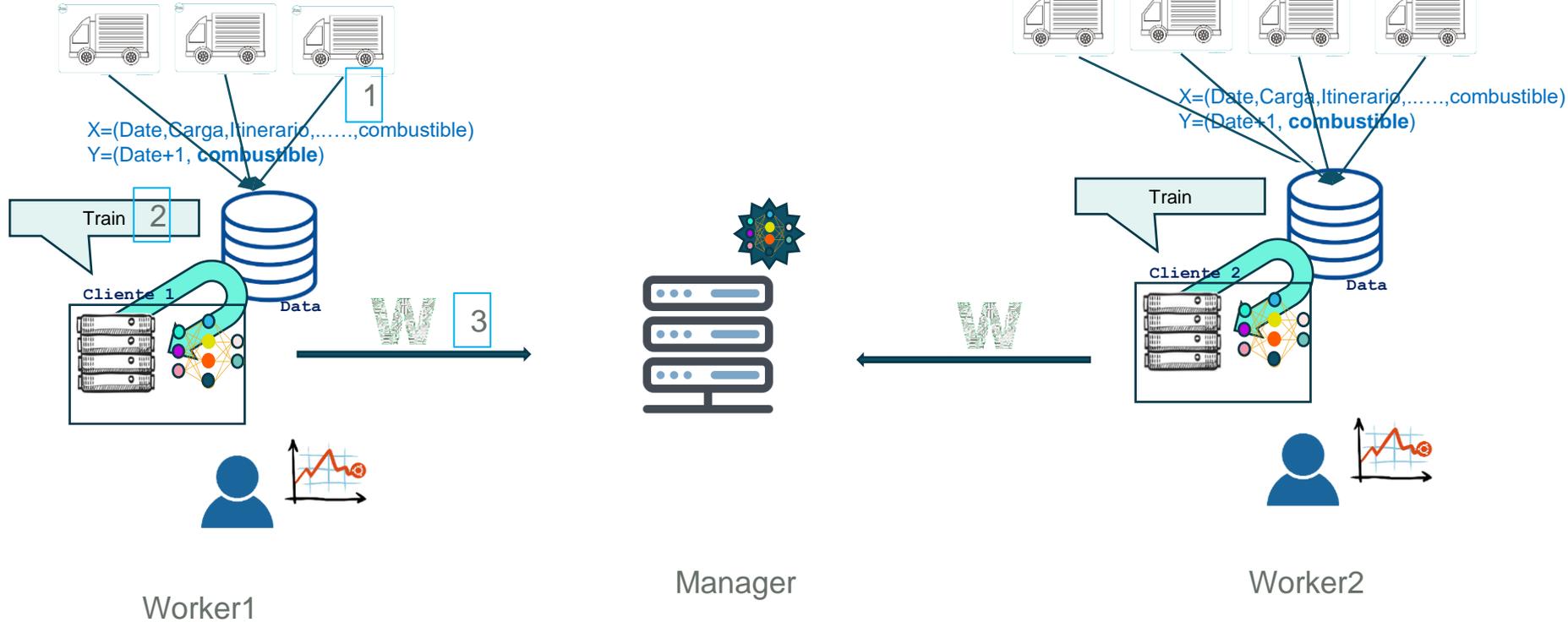
## Centralized



- Baseline for the analysis to explore codes to **speed up distributed machine learning training**.
- **Framework de instanciación.**

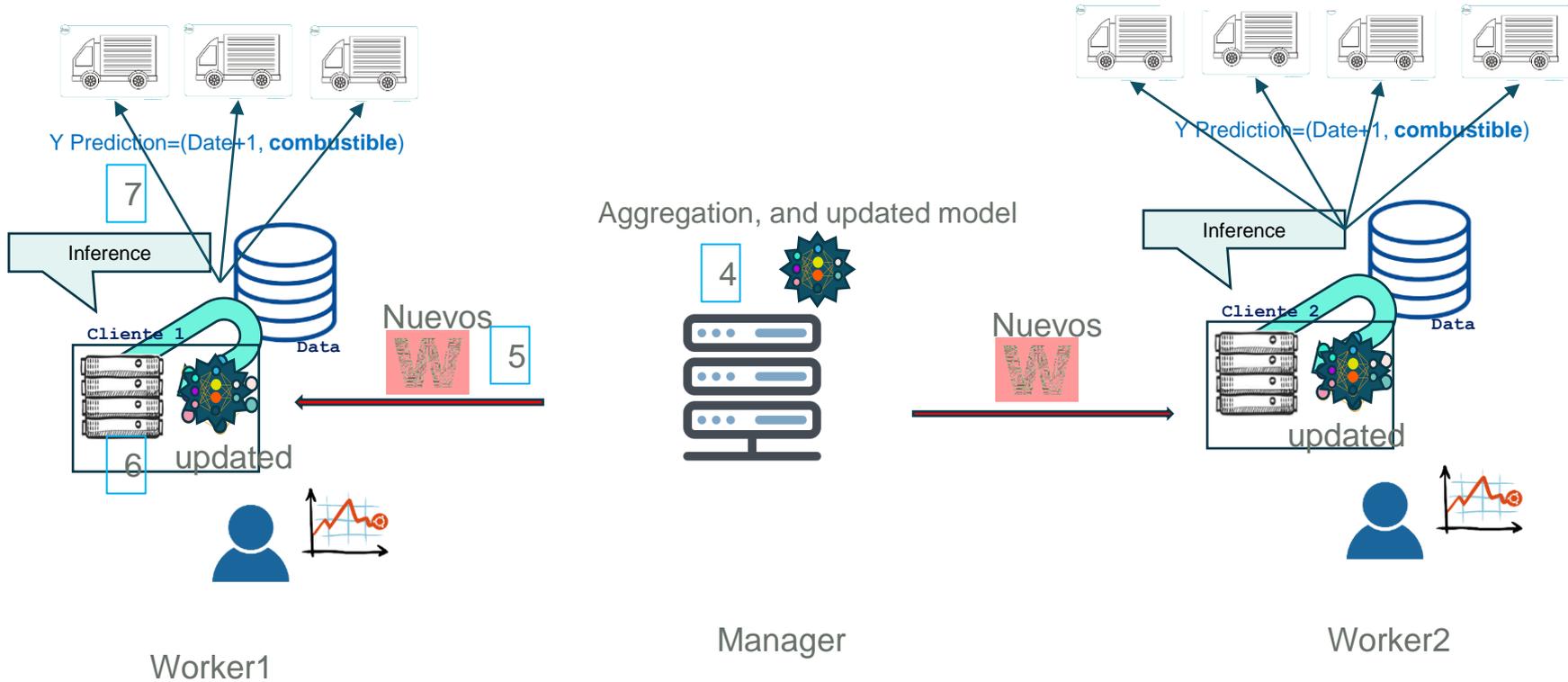
# CASOS de USO SHINE-fleet

## Flujo de FML



# CASOS de USO SHINE-fleet

## Flujo de FML



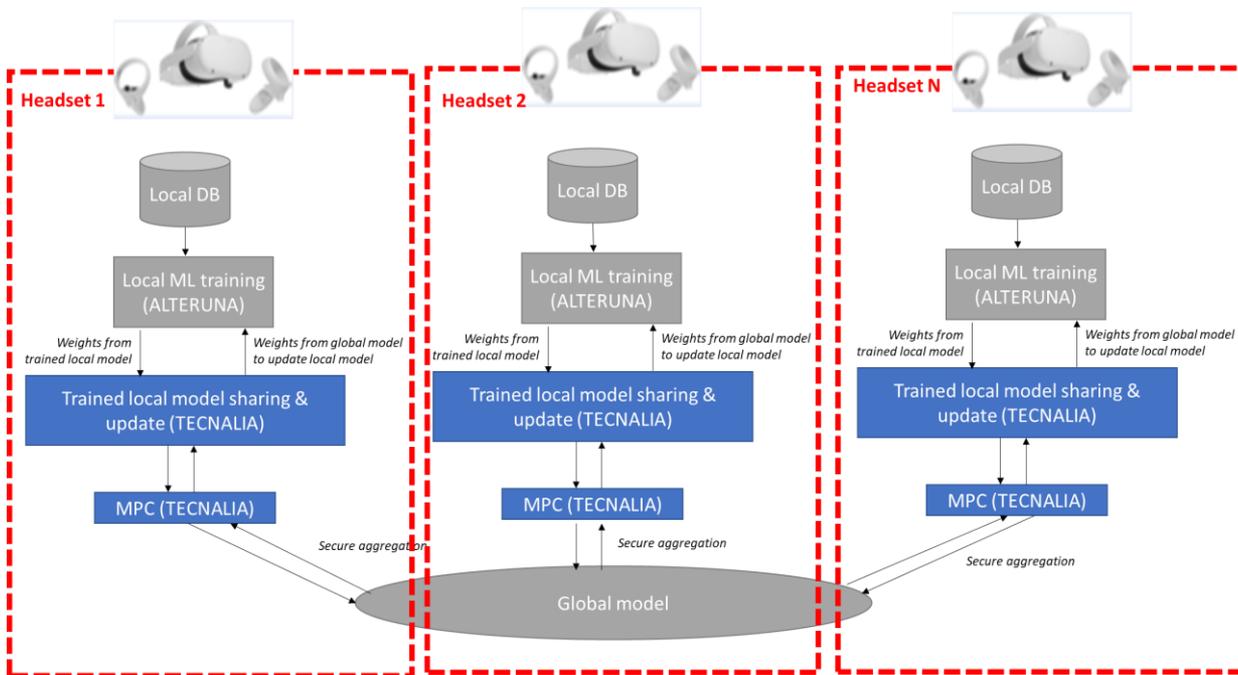


Using Healthentia apps at the edge,  
Healthentia platform centrally



# CASOS de USO Terminet

“Mixed Reality and ML Supported Maintenance and Fault Prediction of IoT-based Critical Infrastructure” addresses the area of maintenance, and lastly”





*Questions??*

*THANKS!!!!*

