

Leveraging Blockchain to Unlock Data for Federated Learning



Agenda

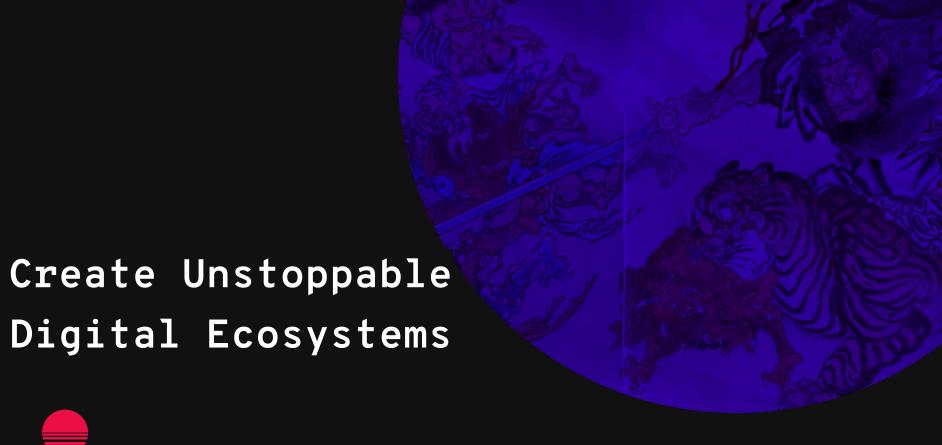
- Who we are
- Overview of Nevermined
 - Problem
 - Vision
 - Data Sharing Ecosystem
 - Data In Situ Compute
 - Data Marketplace
 - Metadata
- Code Demo
 - Use Case
 - Federated Learning
- Q & A

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What is Keyko?

Web3.0 powerhouse with a passion for openness and change.

Keyko is a Swiss based technology company focused on promoting the growth of Digital Ecosystems. We offer unparalleled expertise in the creation and application of large scale data sharing technologies, and are a leader in leveraging decentralized open source platforms like Ethereum, Celo, etc.





Since 2019, the Keyko team's track record speaks for itself







3 Major Ecosystem Launches in <18 months

€60M+ Combined Revenue Generated

€800M+ Combined Ecosystem Market Cap

From 6, to 23 people team in 14 months.

+200 y. of combined experience in web3 & data



BIGCHAIN DB





NTTData



At Keyko, we believe our world is far from homogeneous, and such is our dojo.

We are diverse and disparate. We are young and old. We are unstoppable and we are bold.

We are the way.

Welcome to our dōjō.



DON GOSSEN Black Belt in Execution



GIANLUCA BOCCADIFUOCO Black Belt in Operations & Growth



JAVIER CORTEJOSO DE ANDRES Black Belt in

DevOps & OpSec



JOSE PABLO FERNÁNDEZ Black Belt in



AITOR ARGOMANIZ Black Belt in Technology Solutions



OANA IONESCU Black Belt in Marketing



SAMI MÄKELÄ, PHD Black Belt in Formal Verification 0



Black Belt in



DIMITRI DE JONGHE, PHD Black Belt in Decentralized Systems & Protocols



CLEMENT BIHOREL Black Belt in Product Development



PEDRO GUTIÉRREZ Black Belt in Frontend Architecture

in O



ENRIQUE RUIZ GARCIA Black Belt in Big Data



BRIAN HAACKE Black Belt in Operations & Delivery



RODOLPHE MARQUES Black Belt in Distributed Systems



MARK MESSOW

Black Belt in Strategy & Entrepreneurial Innovation



JERNEJ PREGELJ

Black Belt in Software & Gamification





Blockchain

Swiss-knife web3 services



Project Delivery & Mainnet Launch

We support project pipeline delivery for network implementation and launch



Network Operation, Maintenance & Support

We build and maintain critical network infrastructure



Network Adoption & Token Use Cases

We generate compelling use cases and develop d'Apps

We work with:















Our Products

Keyko was created with the idea in mind of building kick-ass product to fill the gap between web2 and web3.

We incubate interesting innovative ideas.



Nevermined: the world's first enterprise-grade Data Interoperability platform.

Now fundraising Seed Funding



Company governance tool to democratize collective decisions

Building and Testing internally



Problem

- <u>Inaccessible Data</u>: A third party dataset may help grow your business, but you don't know it exists or can't access it
- <u>Compliance Issues:</u> Data Sharing inside or outside your organization creates significant legal & regulatory problems
- <u>No Interoperability</u>: Different datasets & information systems make it difficult & expensive for companies to work together

Vision

Nevermined is a product that provides Data Sharing & Data In Situ Computation solutions to unlock value with actionable insights through 3 main building blocks

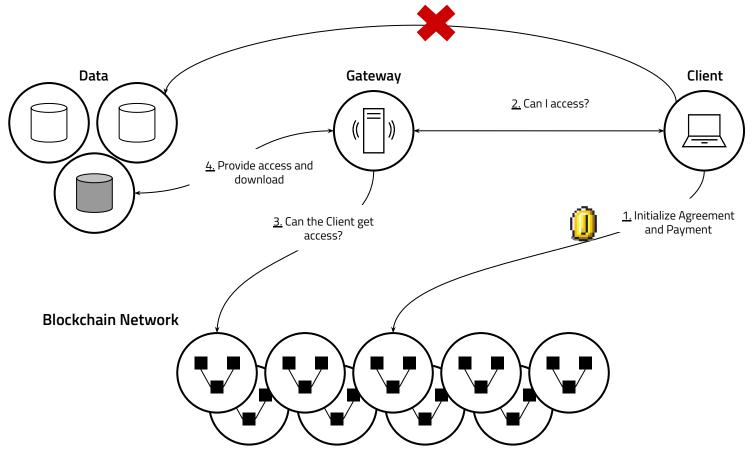
- Data Sharing Ecosystem
- Data In Situ Compute (DISC)
- Data Marketplace

Data Sharing Ecosystem

Enables the data sharing between untrusted parties

- Allows data monetization
- Data Publishing and Consuming
- Decentralized Access Control
- Free or paid access supported
- Data Provenance
- Public or Private blockchain networks

Data Sharing Ecosystem



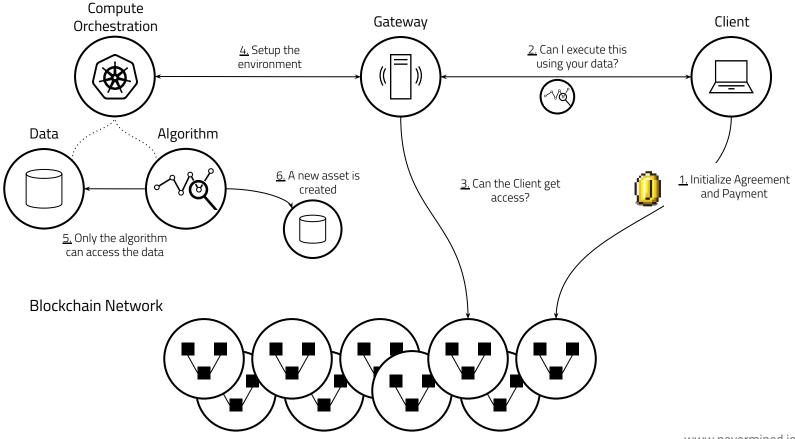
Data In Situ Compute (DISC)

Allows execution of algorithms without moving the data

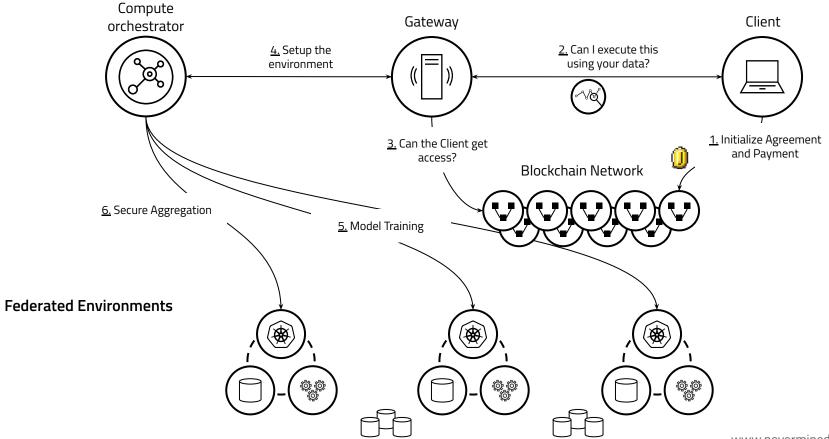
- Supports Federated Learning and Kubernetes workflows
- Data never moves, algorithm goes where data is
- Consumer never get access to the real data
- Orchestration of computing pipelines
- Integration with flexible service agreements
- Can be run in cloud providers or on-premise
- Workflow execution monitoring



Data In Situ Computation



Federated learning & compute workflows





Data Marketplace

Facilitates the interaction with the data ecosystem

- Improved User Experience
- Data Governance
- Search and discovery
- Integration with the data sharing and compute to the data
- Data catalog
- Tokenization and incentives

Metadata

Every asset (dataset, algorithm) in Nevermined has an associated:

- <u>Decentralized Identifier (DID)</u>: A DID is a unique identifier that can be resolved or de-referenced to a standard resource describing the entity (a DID Document or DDO)
- <u>DID document / DID Descriptor Object (DDO)</u>. If a DID is the index key in a key-value pair, then the DID Document is the value to which the index key points. The combination of a DID and its associated DID Document forms the root record for a decentralized identifier.

More info in the Nevermined METADATA and DID Specifications.

Other Notable features

- <u>Provenance</u>: Asset Data Provenance in Nevermined platform based on the <u>W3C</u>
 <u>Provenance specification</u>.
- <u>Identity Management</u>: Nevermined integration with existing identity management solutions like LDAP for more fine grained access control
- Non Fungible Tokens (NFT)
- Split Rewards



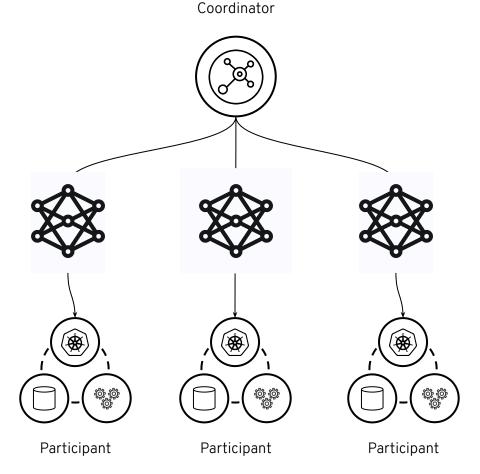
Use Case: Creditcard Fraud Detection

- <u>Federated Learning</u> Using two different datasets describing multiple aspects of creditcard transactions train a model to detect fraudulent transactions.
- <u>Data In-Situ Computation</u> Bring the model to the data so that the data can remain private.
- Demo Use Case:
 - 2 Data Providers publish their respective datasets
 - Data Scientist discovers assets and purchases access to them
 - Data Scientist publishes algorithm and make it discoverable to each data provider
 - Data providers download the algorithm, sets up the execution environment, and begins training
 - Trained models are then aggregated by the coordinator
 - Final trained model is published and consumable by the Data Scientist



Federated Learning

- Collaborative Machine Learning without centralized training data
- Federated Learning enables a set of participants to collaboratively learn a shared prediction model by bringing model training to the data. All the training data remains on premise
- Participants download the current model, improve it by learning from data on premise, and then summarize the changes as a small focused update. This is immediately averaged with other participant updates to improve the shared model.







Q & A

- Website: <u>nevermined.io</u>
- Github: <u>nevermined-io</u>
 - <u>Nevermined SDK JS</u> JavaScript version of the Nevermined SDK to be integrated with front-end applications.
 - Nevermined SDK PY Python version of the Nevermined SDK to be integrated with back-end applications. The primary users are data scientists.
 - Nevermined SDK JAVA Java version of the Nevermined SDK to be integrated with JVM applications. The primary users are data engineers.
- Documentation: <u>docs.nevermined.io</u>
- Discord: https://discord.gg/GZju2qScKq