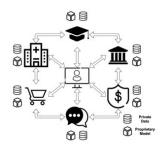
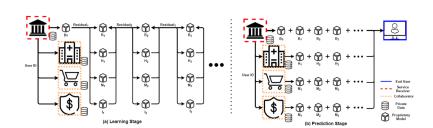
## Assisted machine learning architecture

A disruptive machine learning architecture invented for privacy-sensitive entities to collaborate with each other without sacrificing the quality of gained intelligence.

Technology No. 2021-176, 2020-139





#### **IP Status:**

US Patent Pending; Application #: 17/248,845

Provisional Patent Application Filed; Application #: 63/202,385

## **Applications**

Machine Learning

# Machine learning architecture with high data and model privacy

Concerns of data security and privacy have led to more stringent regulations on the use of data in machine learning. Successful conventional machine learning architectures provide intelligence from user data sets but often require disclosure of that data. Collaborating with privacy is one of the most significant challenges in contemporary machine learning. There, designing machine learning architectures that facilitate not only accuracy, but also privacy and data security is of high interest. In addition, there is also a growing demand for protecting the learner units that manage data.

To address these issues, researchers at the University of Minnesota have developed Assisted Machine Learning Architecture, a disruptive technology invented for privacy-sensitive entities to collaborate without sacrificing the quality of gained intelligence. In Assisted Machine Learning Architecture, an entity/learner assists another entity's machine learning by iteratively exchanging non-private statistics such as confidence scores. This newly developed methodology can be applied to a broad range of machine learning types such as regression and classification, and can allow assistance among numerous entities in a computationally efficient manner.

This invention simultaneously addresses two challenges in the current machine learning ecosystem. 1) Privacy: the state-of-the-art privacy focuses only on data. This technology offers several methods and software architecture that focus on the protection of each learner unit, models as well as data. 2) Design of decentralized machine learning architecture: Each learner has the flexibility of assisting or being assisted by others, which simultaneously facilitates flexibility, fairness, privacy, and personalization, a design drastically different from previous state-of-the-art architectures (such as the current popular Federated learning, a centralized learning architecture, advocated by multiple influential technology companies).

Assisted Machine Learning Architecture is applicable in privacy-aware, transmission-economical, and decentralized learning scenarios such as collaborations between clinics or hospitals, services among financial institutions, distributed learning among smart devices/mobile apps, and between IT companies. Additional applications include machine assisted learning among cameras that observe the same objects, among clinical divisions that record the same patients, etc.

## **Key Benefits & Differentiators**

#### Data:

- Data are not exchanged or released
- Model architectures and parameters are not exchanged
- Only task-relevant statistics are exchanged

#### Models:

- Autonomously-chosen models without a global model
- Personalized learning goals

#### **Architecture:**

- Any individual module can be either service provider or user
- Adversarial modules allowed

#### From the user's perspective:

- Module-level privacy
- Private model & task objective, as well as private data
- Active querying of useful information to assist personalized learning

#### From the service provider's perspective:

Module-level privacy

- Private model as well as private data
- Active responding to benign queries to assist each user's personalized learning in a black-box manner

## **Phase of Development**

#### TRL: 3-4

Software prototype has been developed.

## **Desired Partnerships**

This technology is now available for:

- License
- Sponsored research
- Co-development

Please contact our office to share your business' needs and learn more.

### Researchers

• Jie Ding, PhD, Assistant Professor, Statistics

## References

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