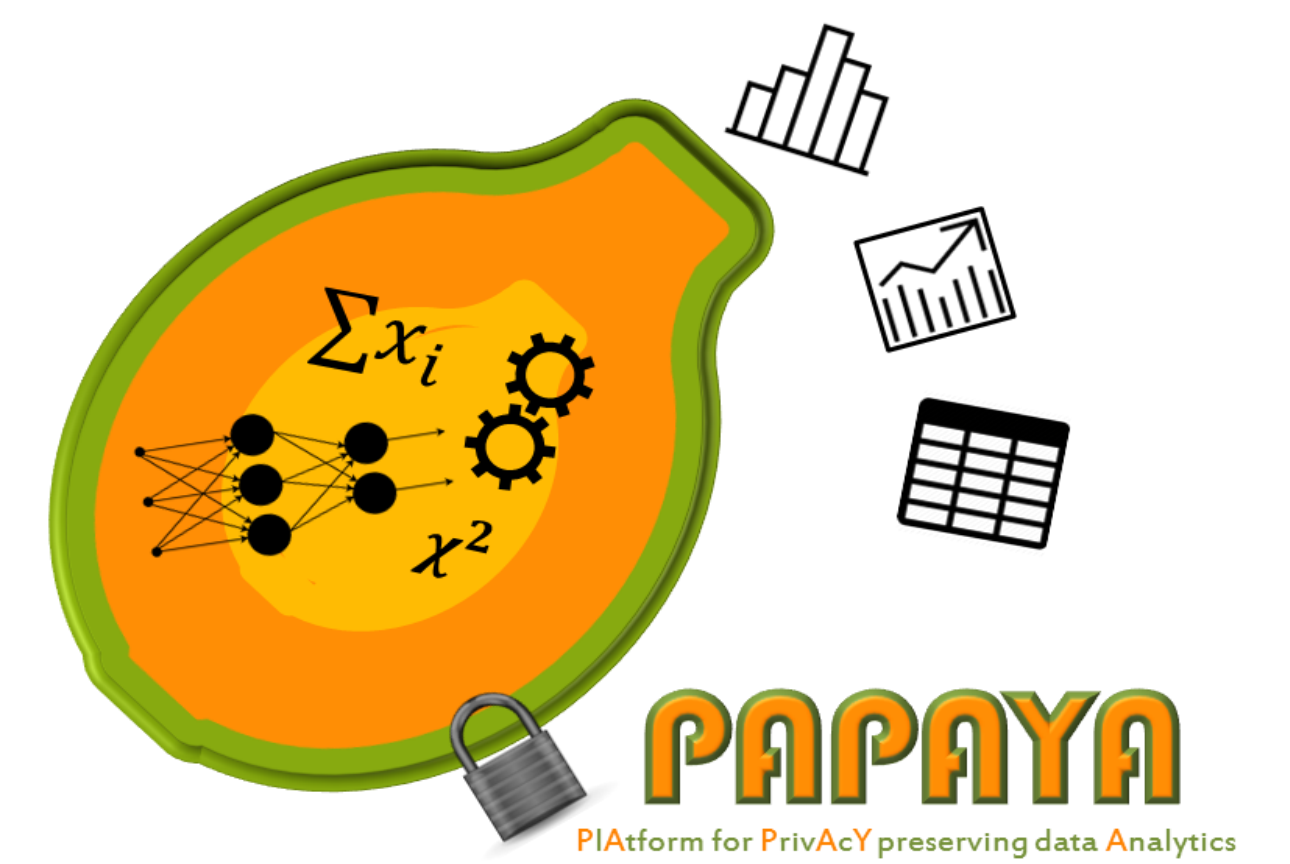


Private Neural Network Predictions

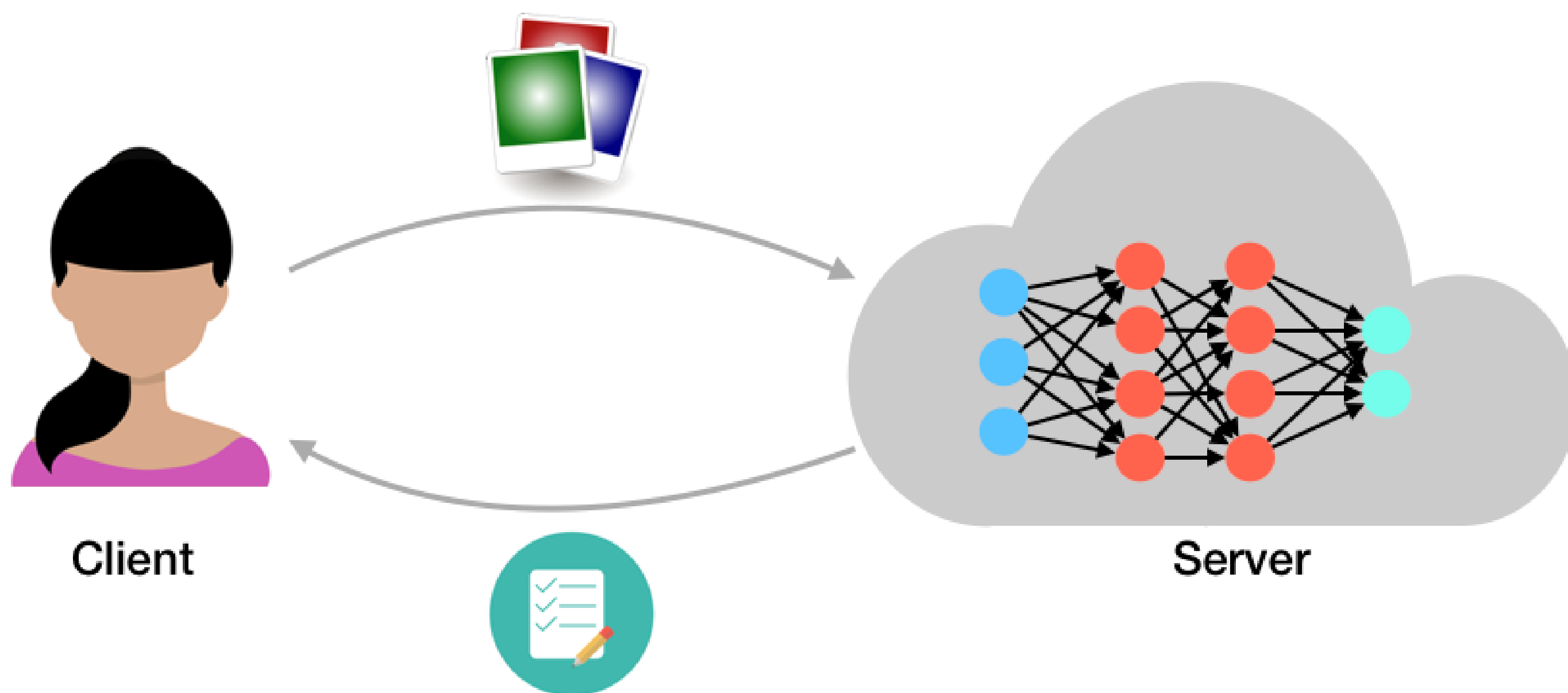
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Machine Learning as a Service



Challenges

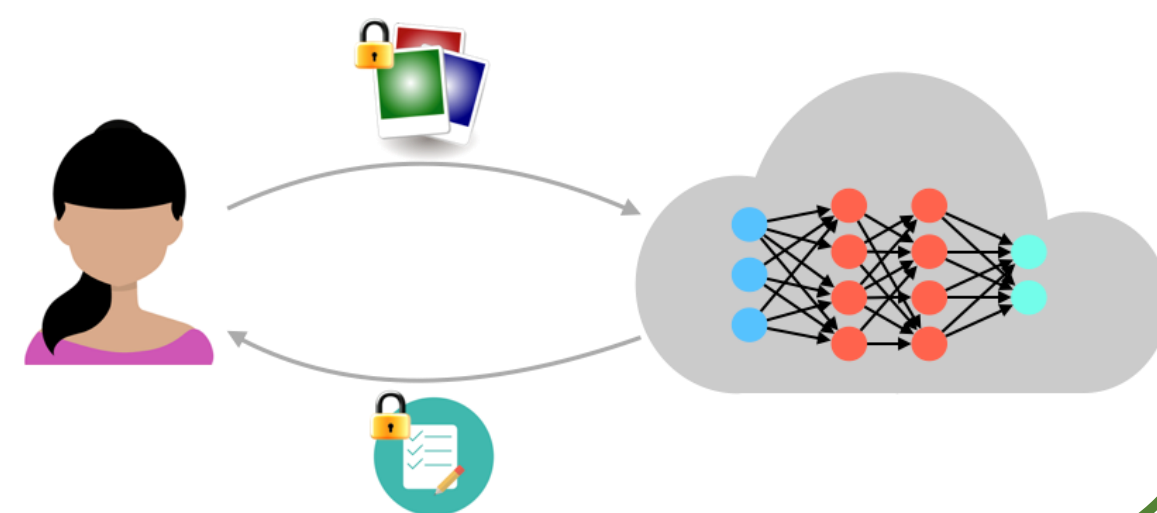
- Efficiency
- Accuracy
- Privacy
 - Sensitive personal data
 - Intellectual property
 - Legal restrictions



Privacy-Preserving Machine Learning as a Service – Existing solutions

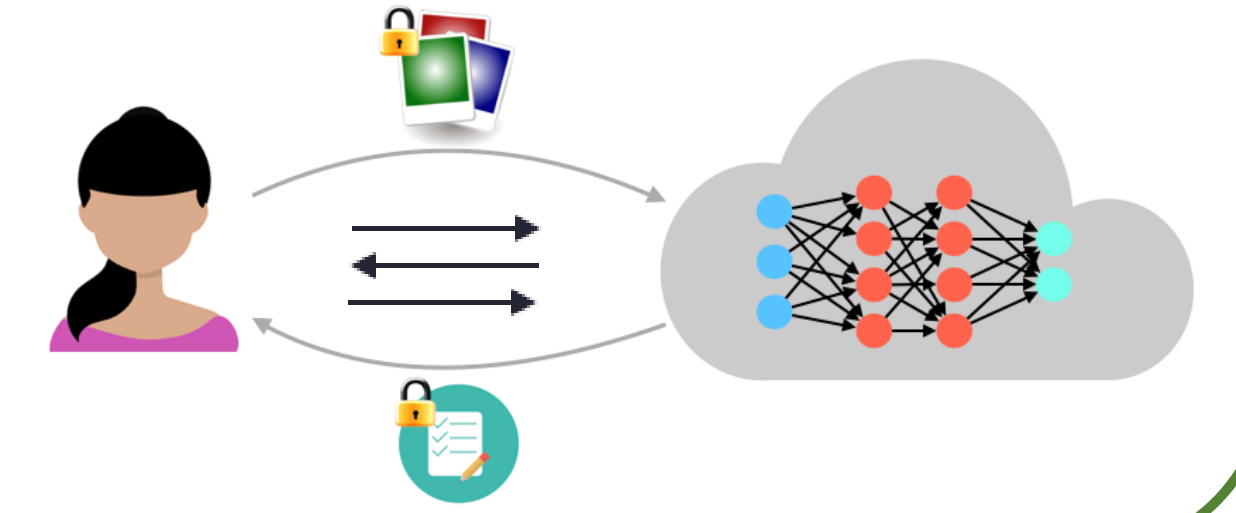
via Homomorphic Encryption

- Allows computations on ciphertexts without decryption
- Lower prediction accuracy
- High computation cost

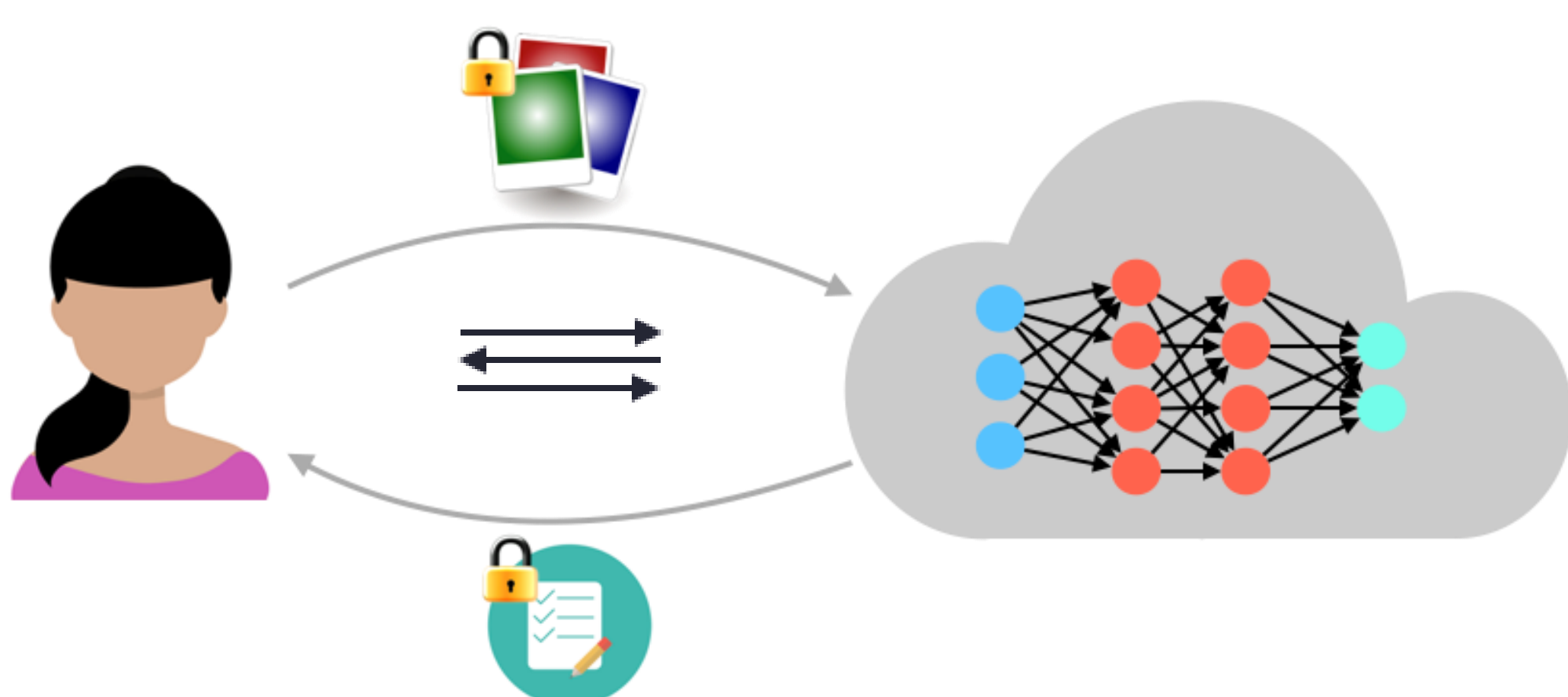


via Secure Two-party Computation

- Allows to jointly compute a function without revealing individual inputs.
- Higher prediction accuracy
- Lower computation cost
- Higher bandwidth usage



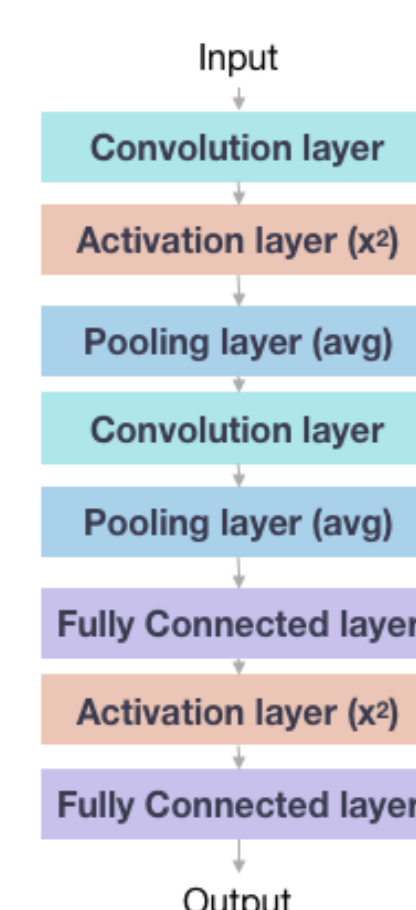
Our Proposal: A Hybrid Protocol for Private Neural Network Predictions



- Uses both homomorphic encryption and secure two-party computation
 - HE for linear operations
 - 2PC for non-linear operations
- Switches between HE and 2PC
- Less computation time compared to HE
- Less bandwidth usage compared to 2PC
- Similar level of accuracy with 2PC

Results

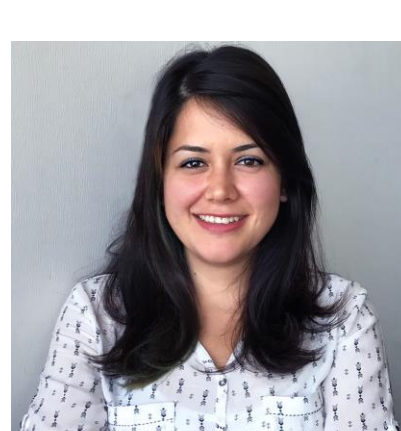
- Paillier cryptosystem for homomorphic encryption
- ABY library for 2PC operations
- Computation cost 30-fold better than HE
- Communication cost 27-fold better than 2PC



Technique	Computation Cost (s)	Communication Cost (MB)
HE ^[1]	297	372.2
2PC ^[2]	1.2	47.6
Hybrid	10	1.73

References:

- [1] Gilad-Bachrach, Ran, et al. "Cryptonets: Applying neural networks to encrypted data with high throughput and accuracy." *International Conference on Machine Learning*, 2016.
- [2] Liu, Jian, et al. "Oblivious neural network predictions via miniomn transformations." *Proceedings of the 2017 ACM SIGSAC Conference on Computer and Communications Security*. ACM, 2017.



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