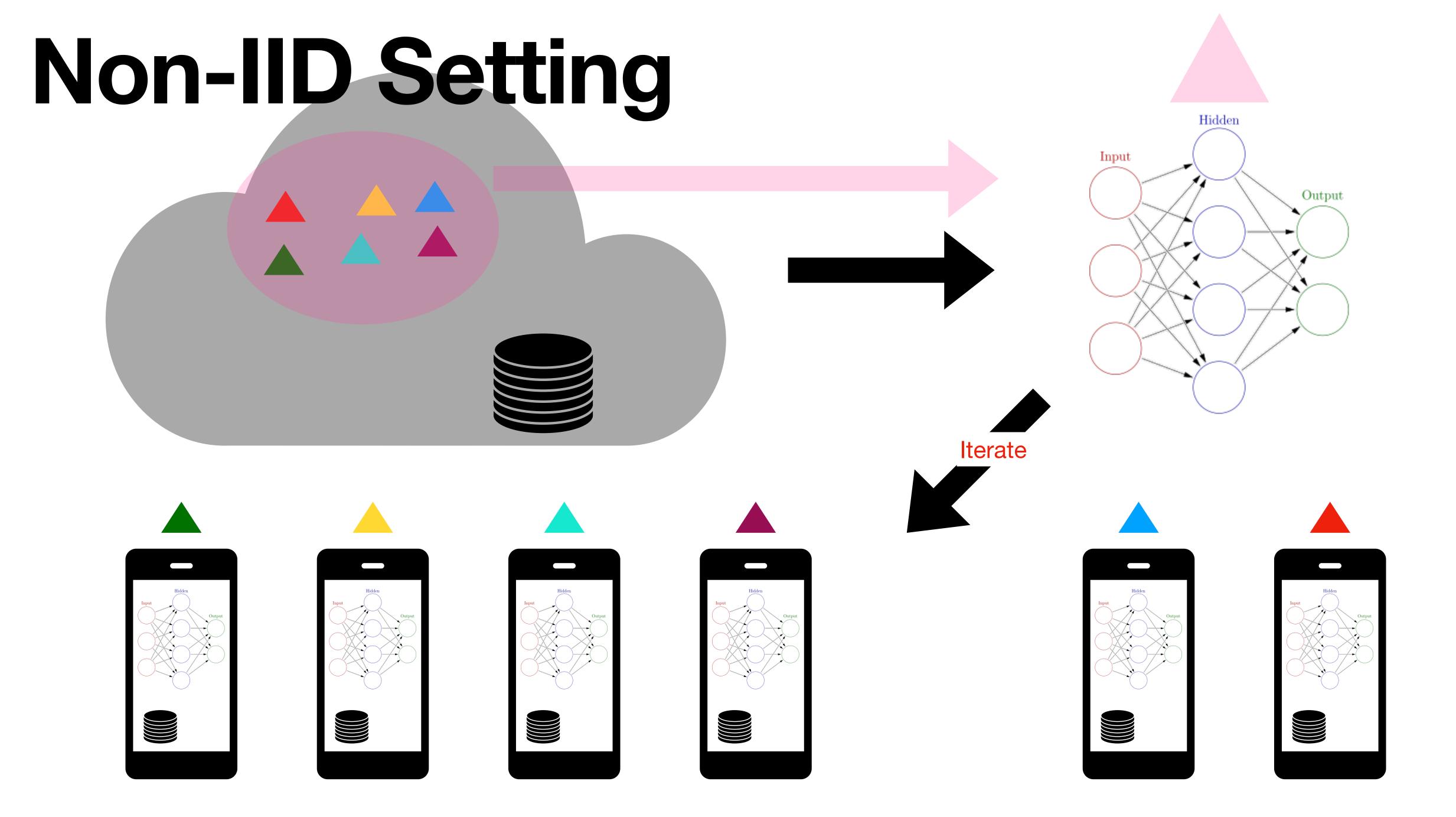




## Non-IID Setting

## Communication-Efficient Learning of Deep Networks from Decentralized Data, AISTATS, 2017



## Federated Optimization

## Key properties different from a typical distributed optimization problem

- Non i.i.d
  - Local dataset will not be representative of the population distribution
- <u>Unbalanced</u>
  - Varying amounts of local training data
- Massively distributed
  - The number of clients is much larger than the number of examples per client
- Limited communication
  - Devices are frequently offline or on slow