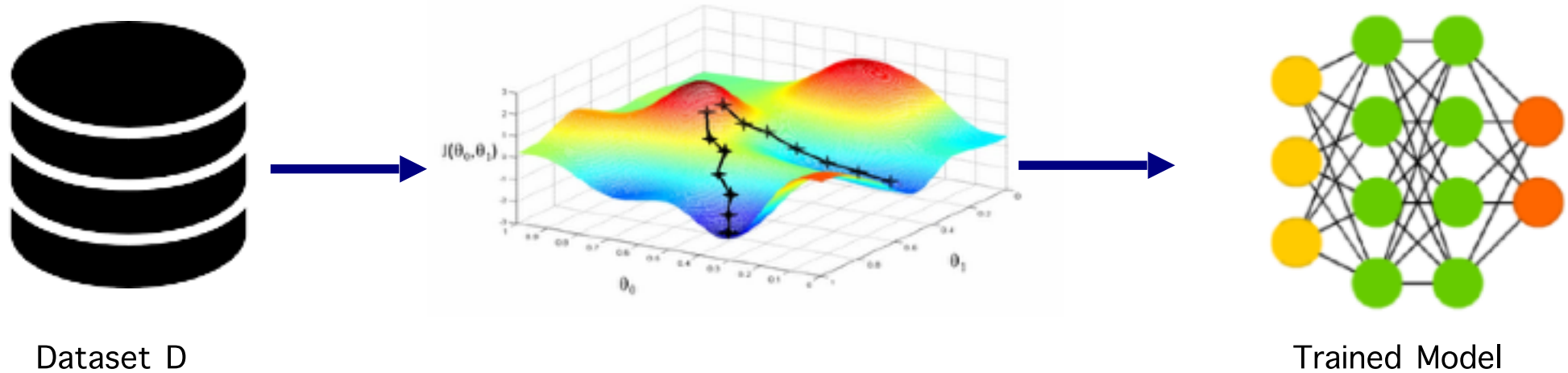
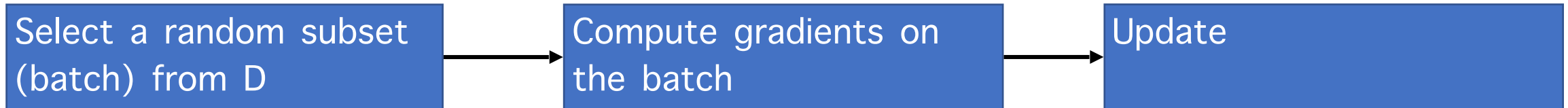


Stochastic Gradient Descent (SGD)



Repeat ..



.. until model convergence (i.e., many epochs)

Differential Privacy (Weaker Notion)

X : The data *universe*.

$D \subset X$: The dataset (one element per person)

Definition: An algorithm M is (ϵ, δ) -**differentially private** if for all pairs of neighboring datasets D, D' , and for all outputs x :

$$\Pr[M(D) = x] \leq \exp(\epsilon) * \Pr[M(D') = x] + \delta$$

Quantifies information leakage

Allows for a small probability of failure