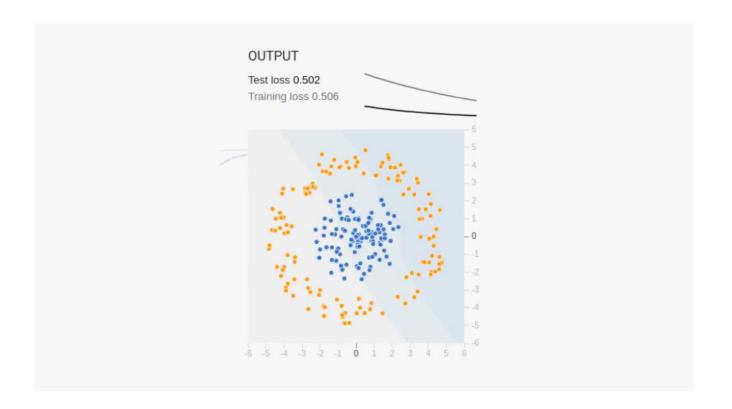
# **High Training Time**

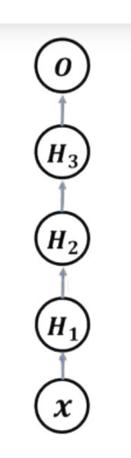




Neural Networks taking a lot of time to converge

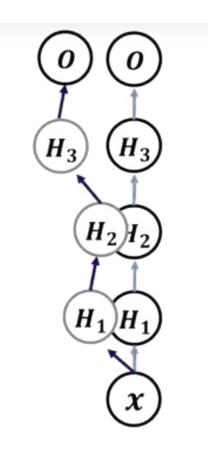


# Reason: Change in Data Distribution across layers



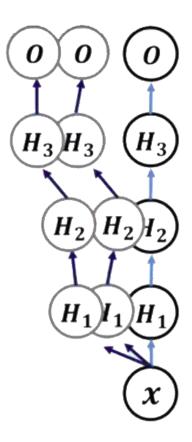


# Problem : Change in Data Distribution across layers



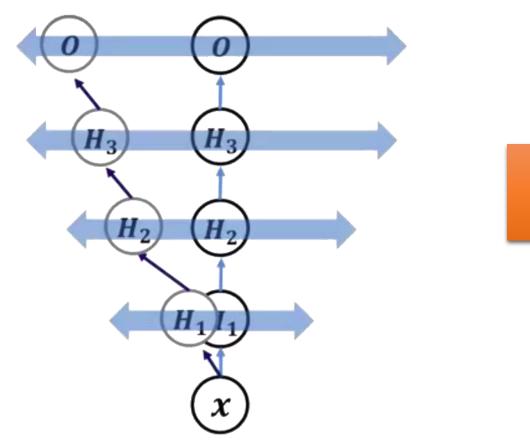


### Problem: Change in Data Distribution across layers





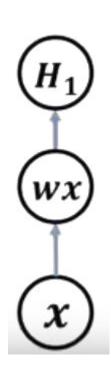
### Problem: Change in Data Distribution across layers

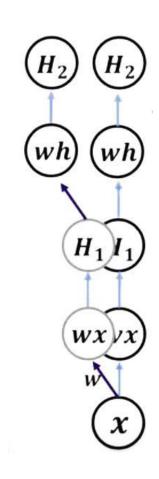


Internal Covariate Shift



#### Solution: BatchNormalization





BN (wwh) $H_1$  $\widetilde{wx}(wx)$ 

Without BatchNorm

With BatchNorm



#### BatchNormalization: Technical Perspective

$$\mu_B = \frac{1}{m} \sum_{i=1}^m x^i$$

**Batch Mean** 

$$\sigma_B^2 = \frac{1}{m} \sum_{i=1}^m (x_i - \mu_B)^2$$

**Batch Variance** 

$$\widehat{x}_i = \frac{x_i - \mu_B}{\sqrt{\sigma_B^2 + \varepsilon}}$$

Normalize

$$y_i = \gamma \widehat{x} + \beta \equiv BN_{\gamma,\beta}\widehat{x_i}$$

Scale and Shift



# Thank You

