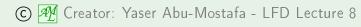
### Outline

Bias and Variance

Learning Curves



### Expected $E_{\text{out}}$ and $E_{\text{in}}$

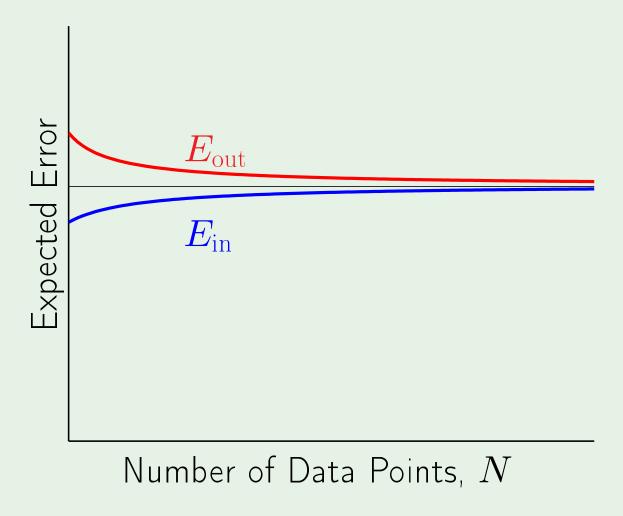
Data set  $\mathcal{D}$  of size N

Expected out-of-sample error  $\mathbb{E}_{\mathcal{D}}[E_{\mathrm{out}}(g^{(\mathcal{D})})]$ 

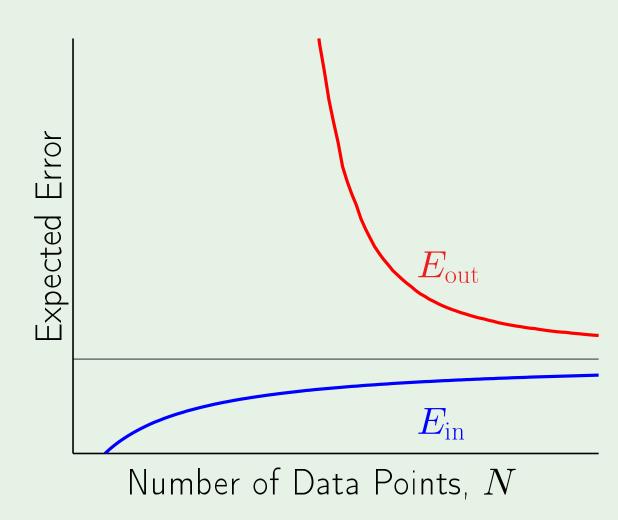
Expected in-sample error  $\mathbb{E}_{\mathcal{D}}[E_{\mathrm{in}}(g^{(\mathcal{D})})]$ 

How do they vary with N?

#### The curves

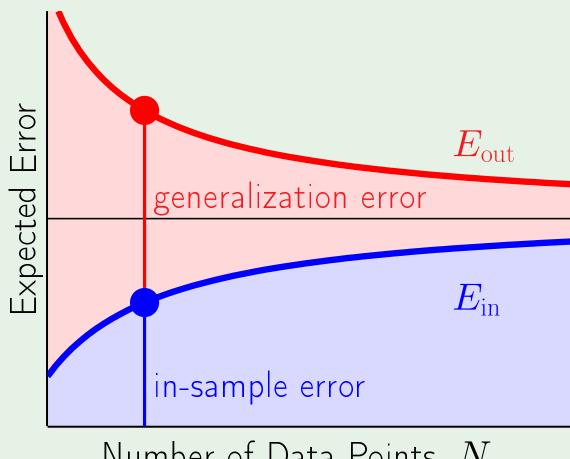


# Simple Model



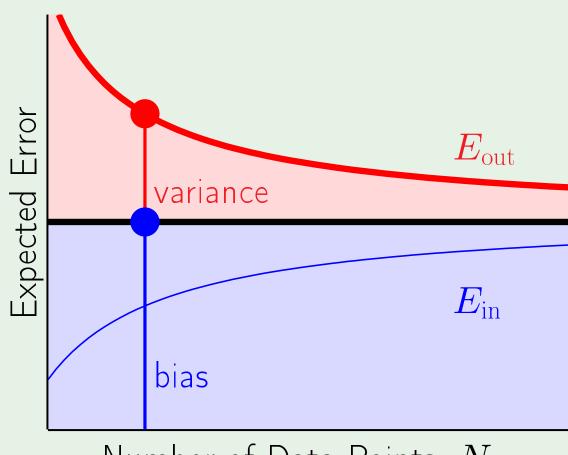
Complex Model

#### VC versus bias-variance



Number of Data Points, N

# VC analysis



Number of Data Points, N

### bias-variance

20/22