



Session 3

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Train/Dev/Test (cont.)

Data



Train Set

Dev Set
(aka Validate Set)

Test Set

Split Ratio?

50%-25%-25%

/

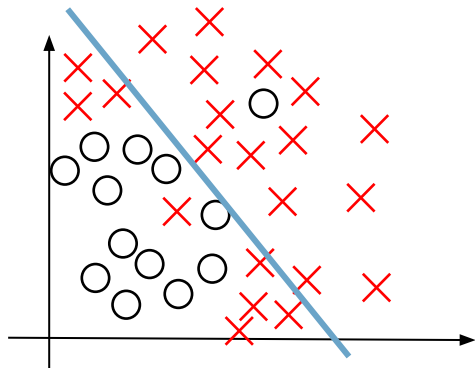
60%-20%-20%

98%-1%-1%

For big dataset in order of 1,000,000

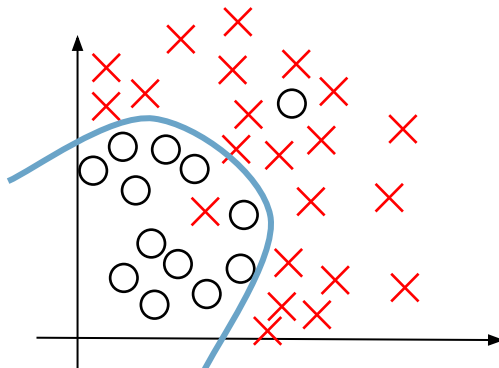


Bias and Variance

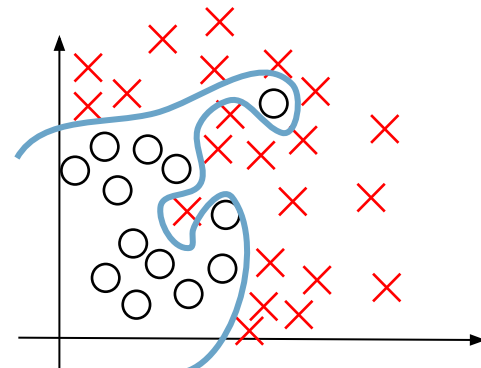


high bias

underfitting



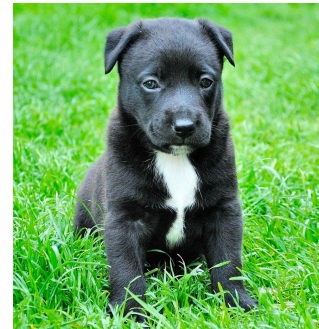
"just right"



high variance

overfitting

Bias and Variance (cont.)



Cat classification

Dev set error:

1%

15%

15%

0.5%

Train set error:

11%

16%

30%

1%

High Variance

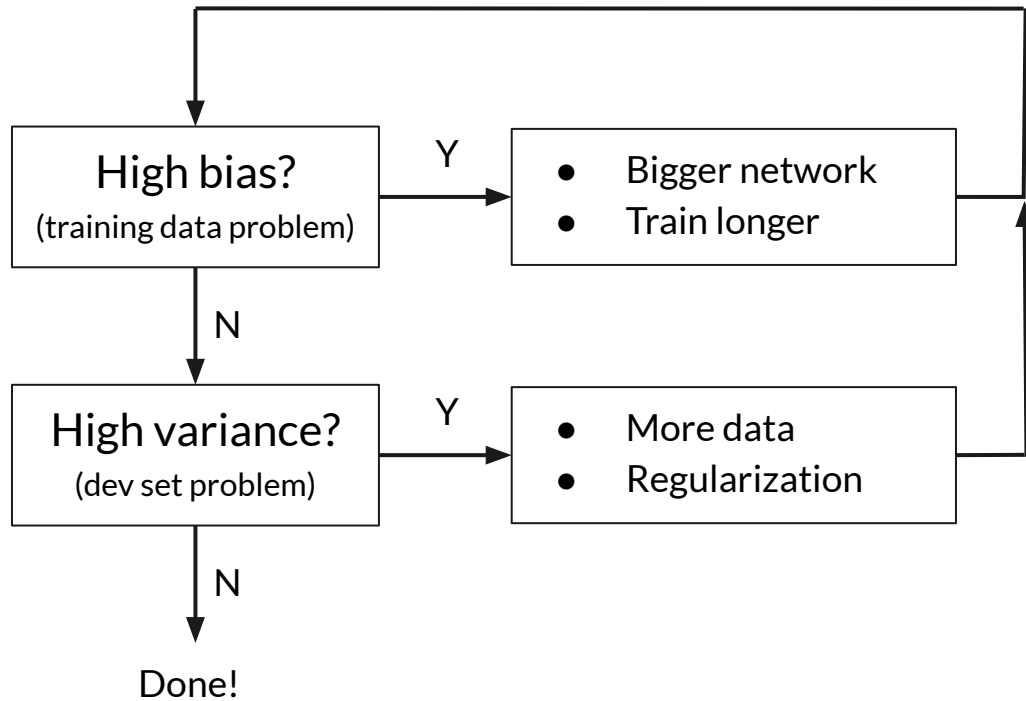
High Bias

High Bias
&
High Variance

Low Bias
&
Low Variance



Basic recipe for machine learning



Regularization

- L2 Regularization
- Dropout Regularization



Logistic Regression

$$\min_{w, b} J(w, b)$$

$$w \in \mathbb{R}^{n_x}, b \in \mathbb{R}$$

$$J(w, b) = \frac{1}{m} \sum_{i=1}^m \mathcal{L}(\hat{y}^{(i)}, y^{(i)}) + \frac{\lambda}{2m} \|w\|_2^2$$

$$\|w\|_2^2 = \sum_{j=1}^{n_x} w_j^2 = w^T \cdot w$$



Neural Network

$$J(w^{[1]}, b^{[1]}, \dots, w^{[L]}, b^{[L]}) = \frac{1}{m} \sum_{i=1}^m \mathcal{L}(\hat{y}^{(i)}, y^{(i)}) + \frac{\lambda}{2m} \sum_{l=1}^L \|w^{[l]}\|_F^2$$

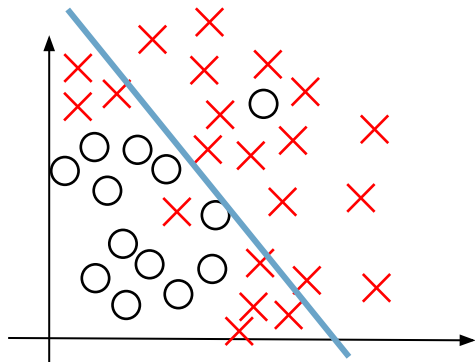
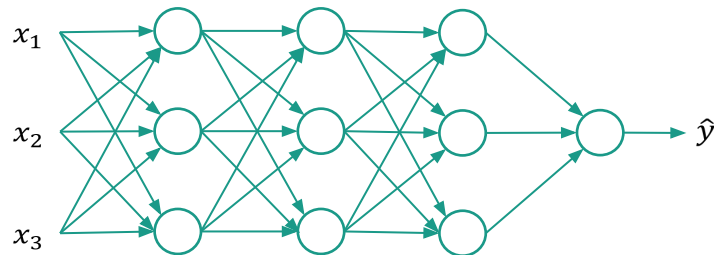
$$\|w^{[l]}\|_F^2 = \sum_{i=1}^{n^{[l-1]}} \sum_{j=1}^{n^{[l]}} (w_{ij}^{[l]})^2$$

$$dw^{[l]} = (\text{from backprop}) + \frac{\lambda}{m} w^{[l]}$$

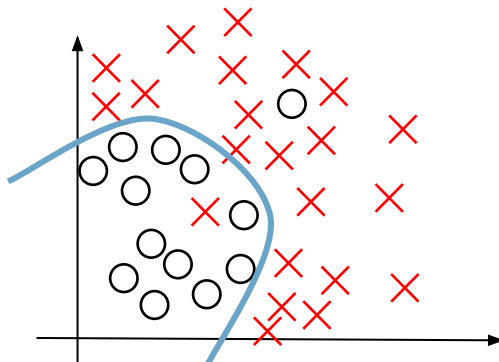
$$w^{[l]} = w^{[l]} - \alpha dw^{[l]}$$

Why does it work?

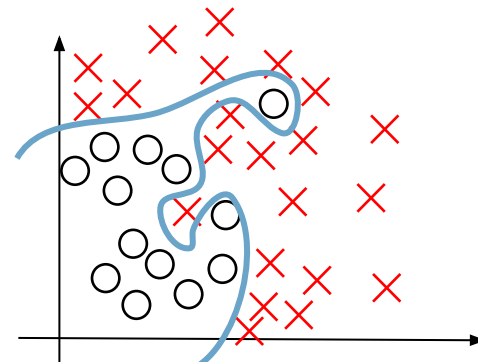
$$J = \frac{1}{m} \sum_{i=1}^m \mathcal{L}(\hat{y}^{(i)}, y^{(i)}) + \frac{\lambda}{2m} \sum_{l=1}^L \|w^{[l]}\|_F^2$$



high bias



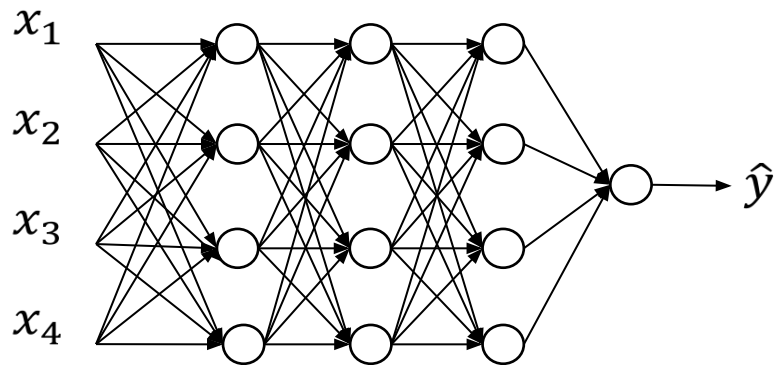
"just right"



high variance



Dropout Regularization



No dropout at Test time!

