#### E9 205 Machine Learning for Signal Procesing

**Considerations in Deep NN learning** 

15-11-2017

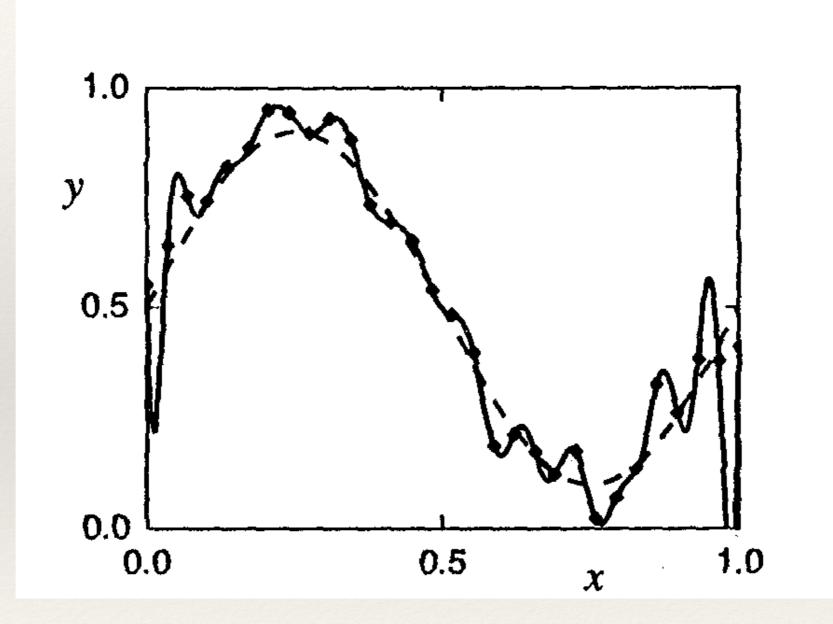




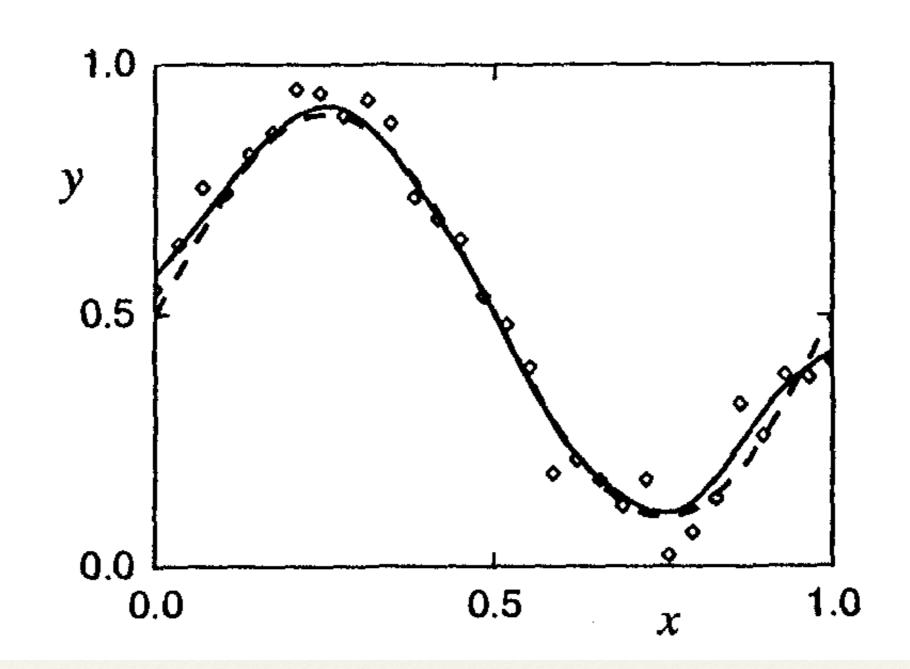
## Bias Variance Trade Off and Overfitting

$$(\text{bias})^2 = \frac{1}{2} \int \{\mathcal{E}_D[y(\mathbf{x})] - \langle t | \mathbf{x} \rangle\}^2 p(\mathbf{x}) d\mathbf{x}$$
  
variance 
$$= \frac{1}{2} \int \mathcal{E}_D[\{y(\mathbf{x}) - \mathcal{E}_D[y(\mathbf{x})]\}^2] p(\mathbf{x}) d\mathbf{x}.$$

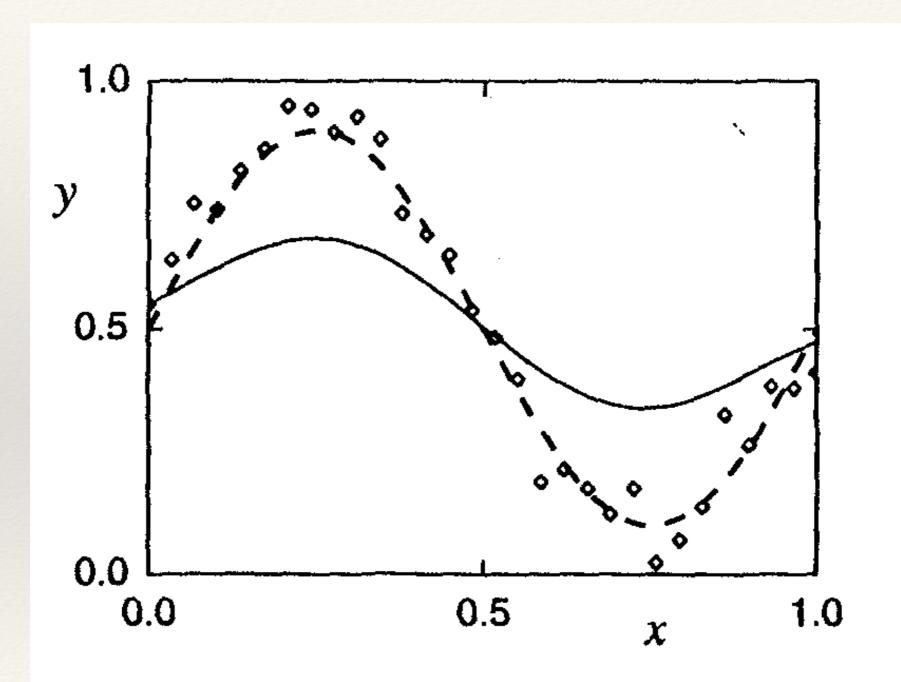
## Bias Variance Trade Off and Overfitting



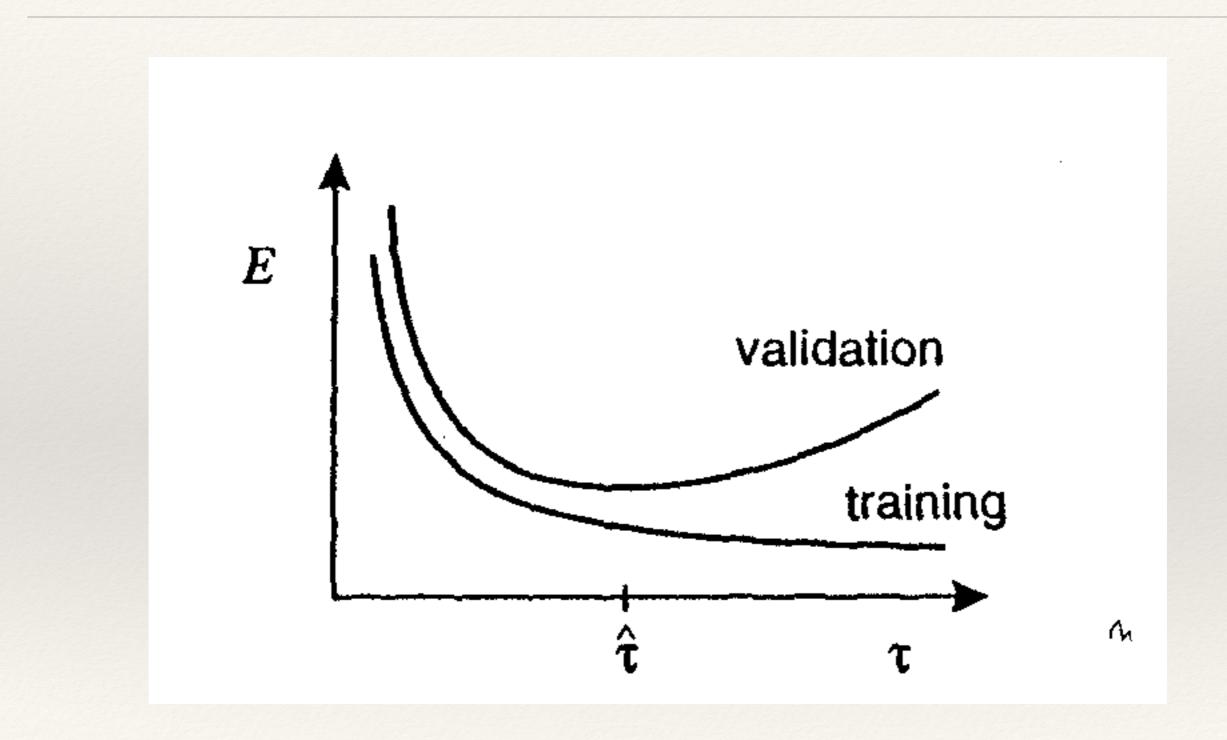
# Weight Decay Regularization



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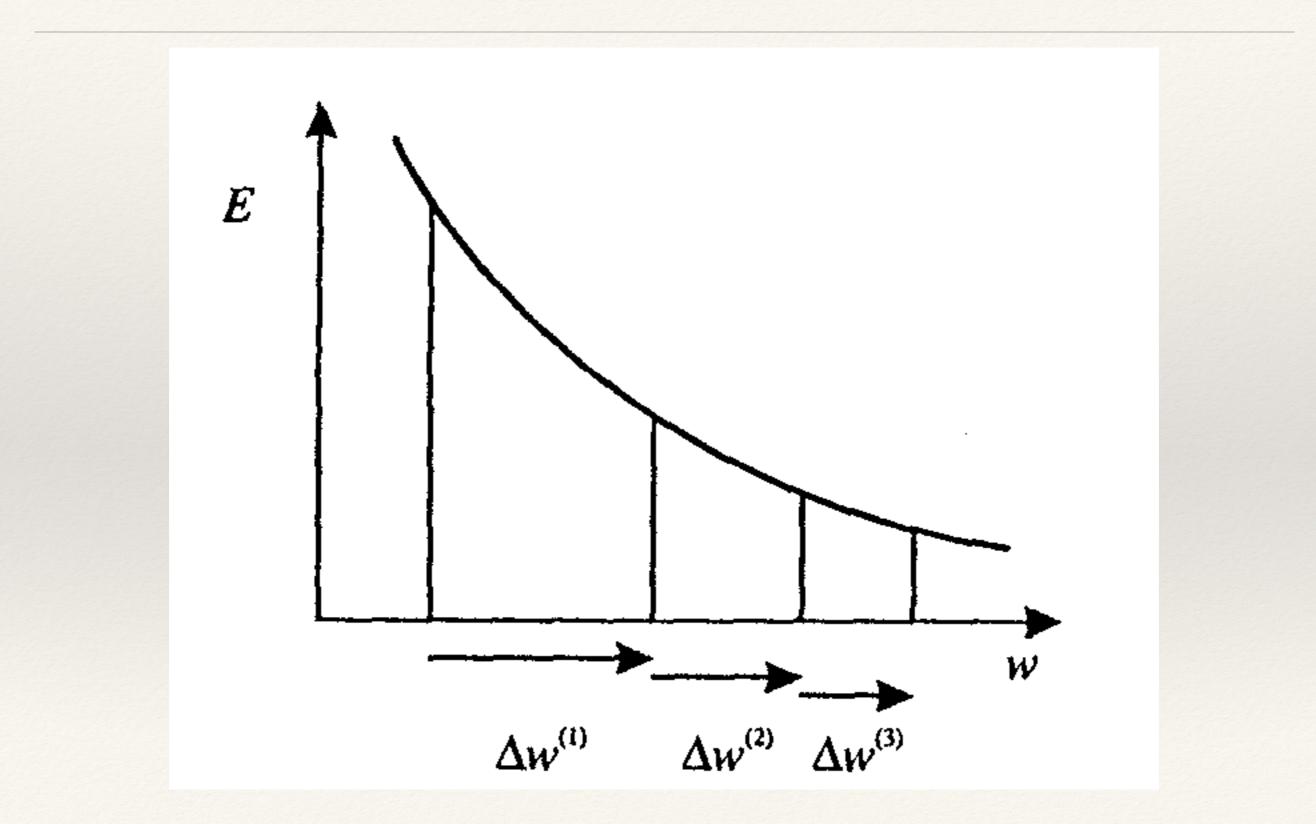
Early Stopping



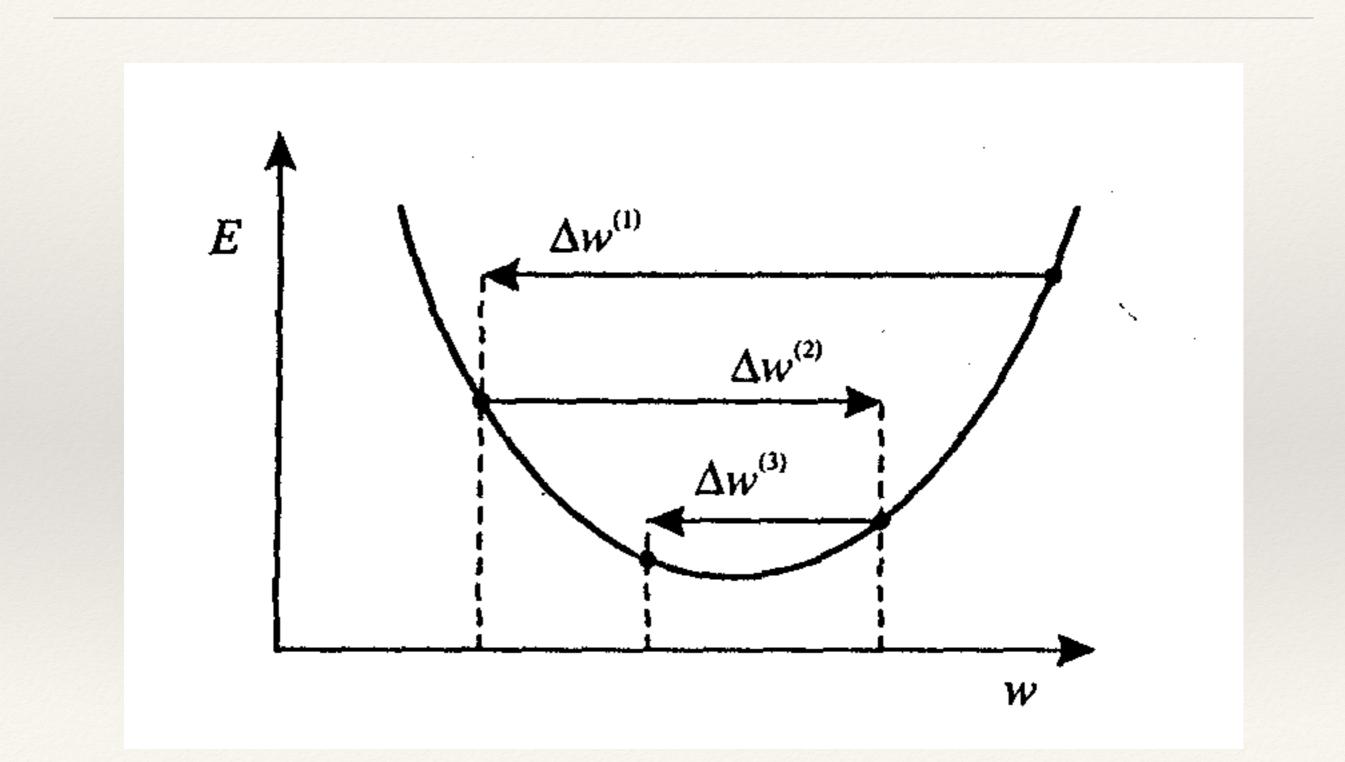
# Attempts to Improve Learning

- \* Increasing the amount of training data
- Regularization (eg. weight decay)
- Early stopping using cross validation
- \* Training data with noise.
- Committees of Neural Networks

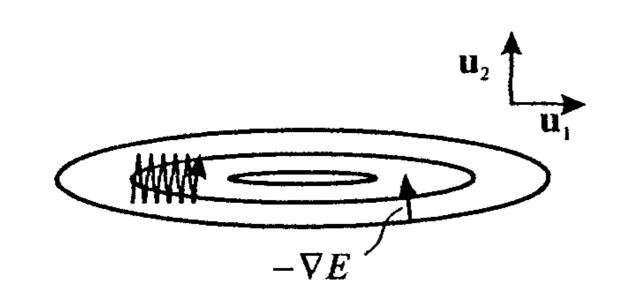
## Momentum



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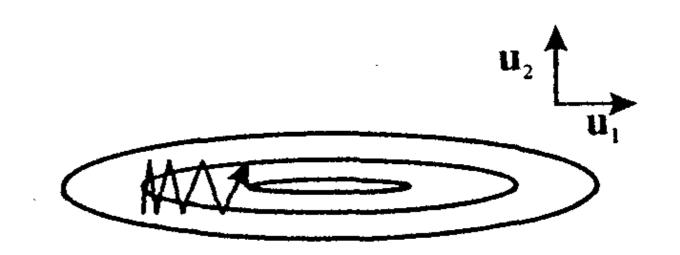


## Momentum

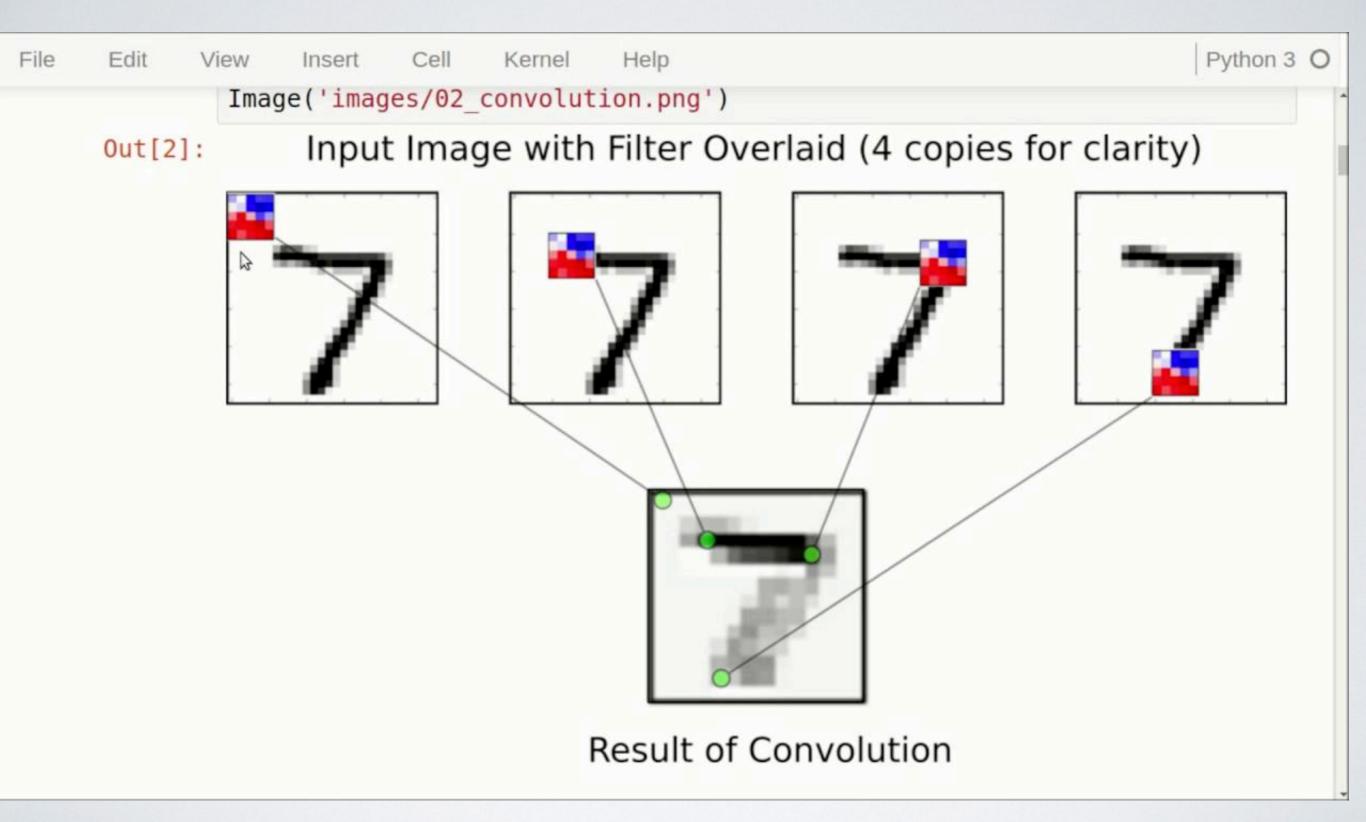


#### **Without Momentum**

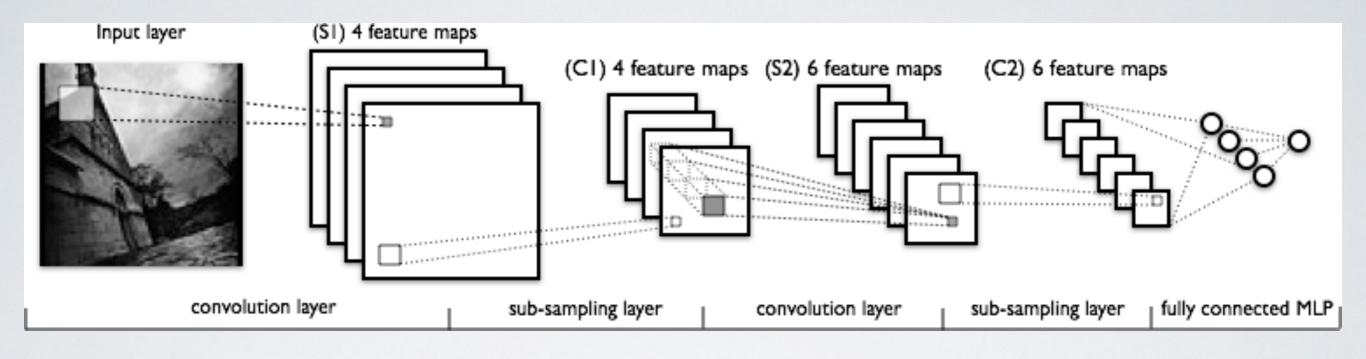
#### With Momentum



### Convolution Operation (Images)

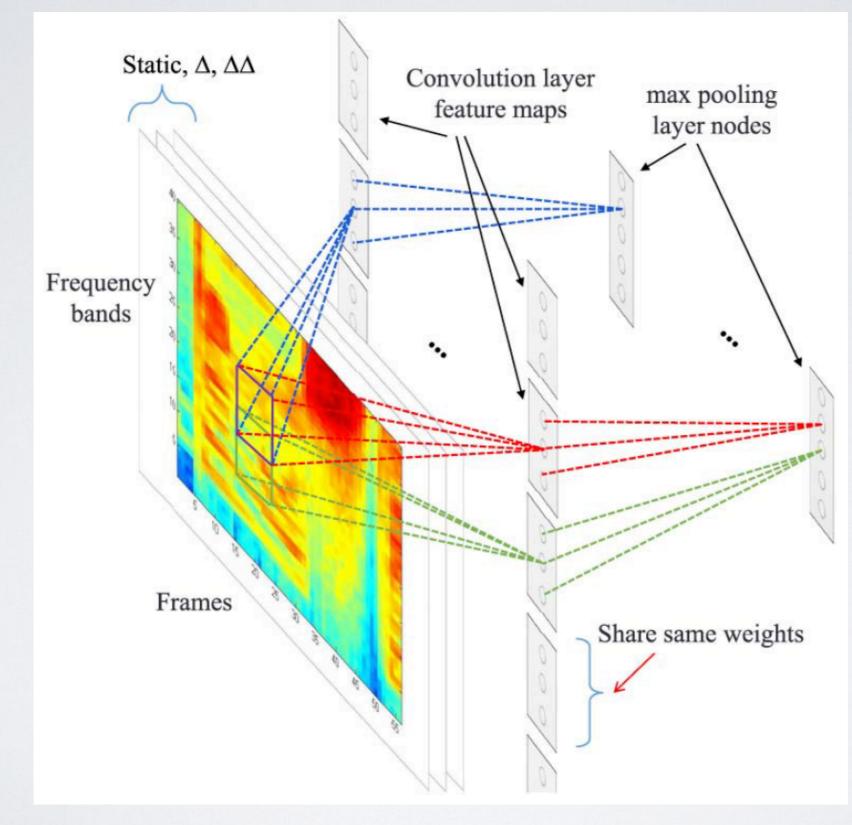


#### **Convolutional Networks**



- Multiple levels of filtering and subsampling operations.
- Feature maps are generated at every layer.

#### **CNNs for Speech**



"Speech Recognition Wiki"