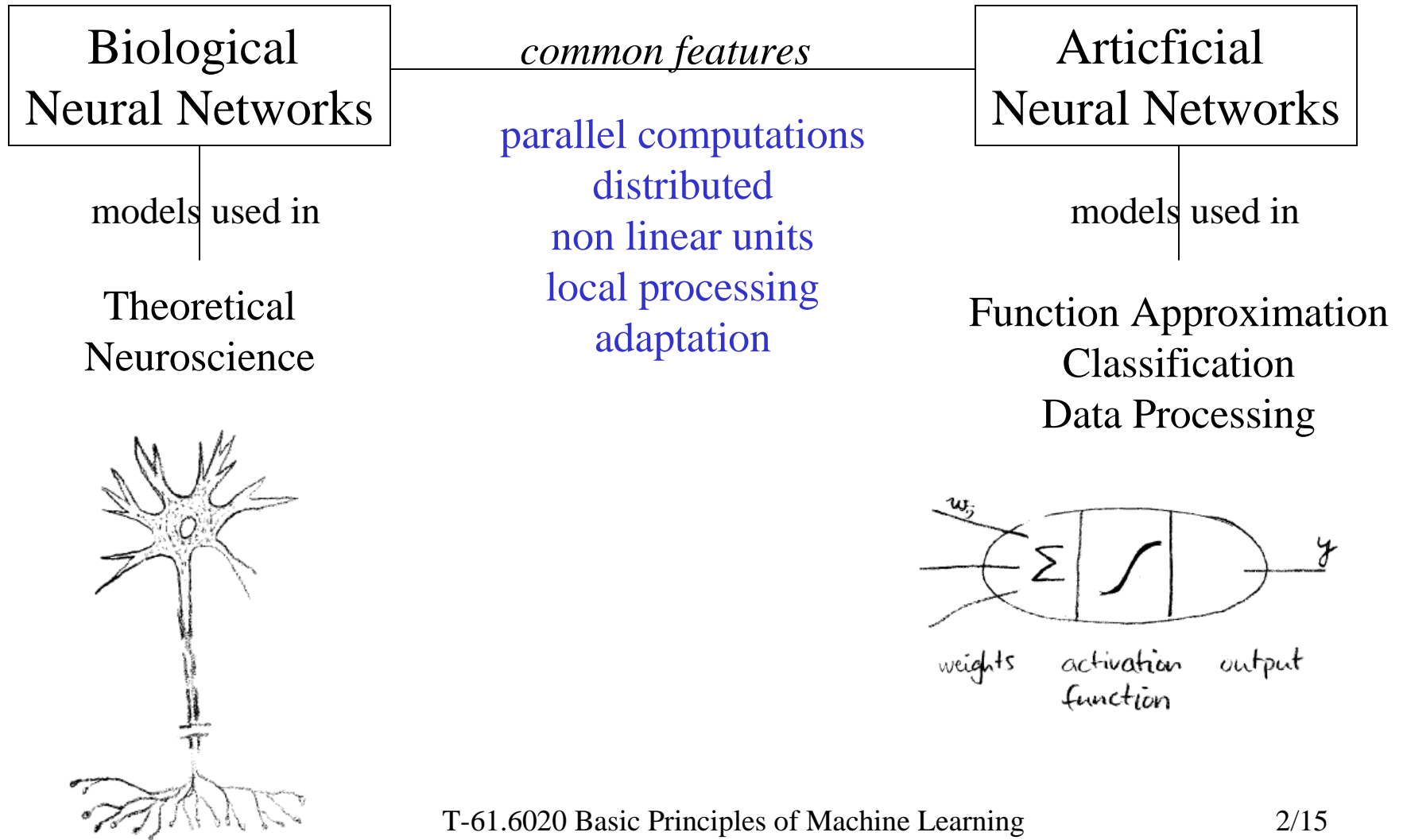


# Neural Networks

Marcus Dobrinkat      Tino Ojala

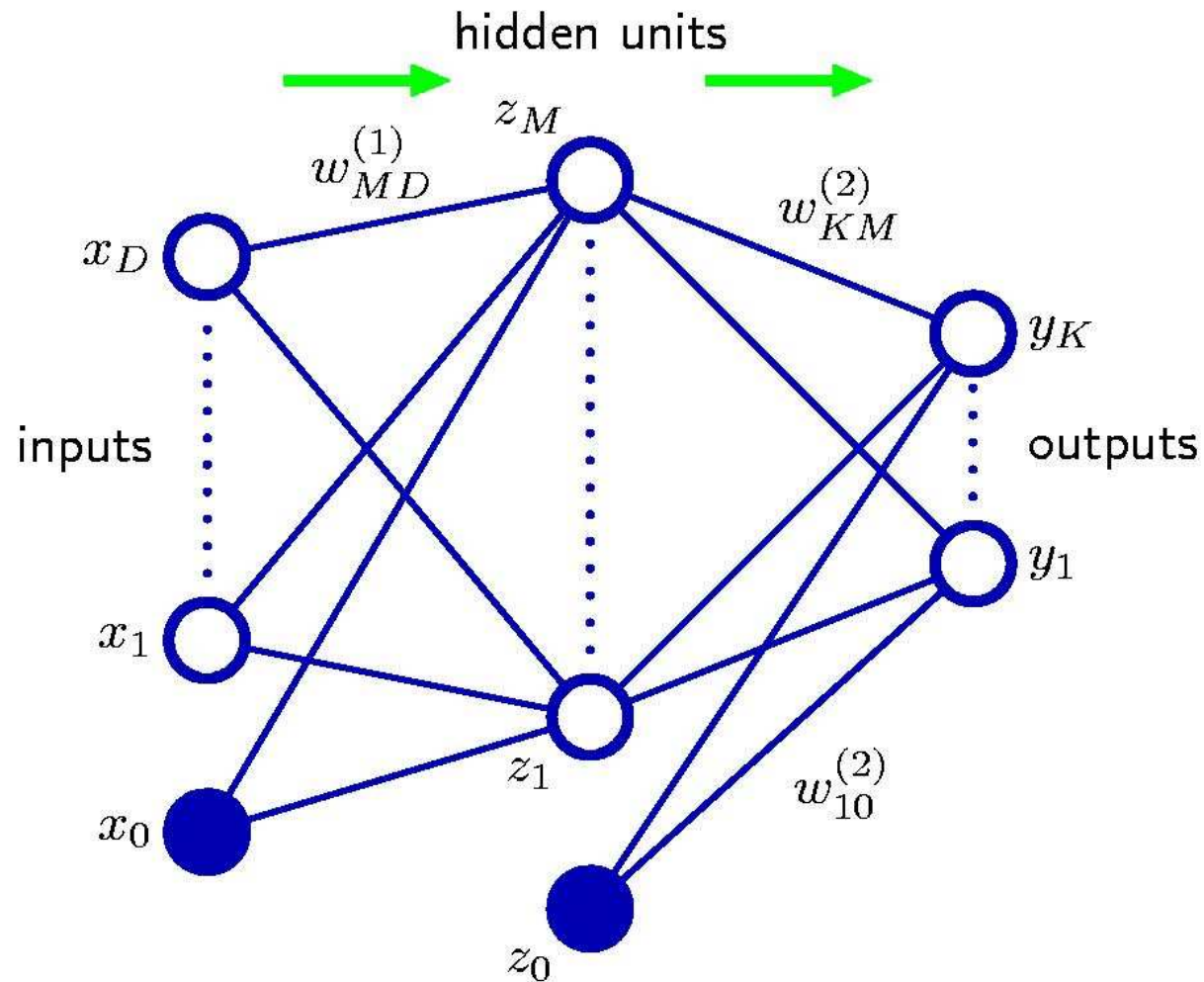
# Introduction



# Introduction

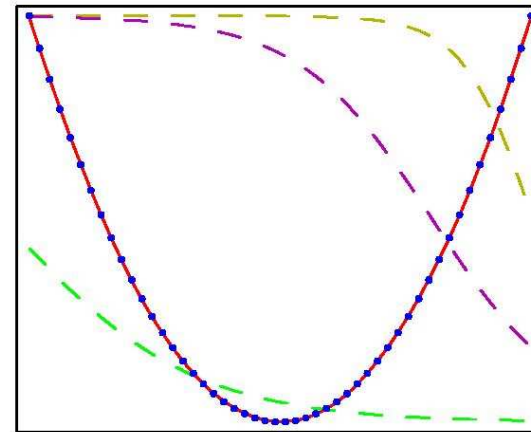
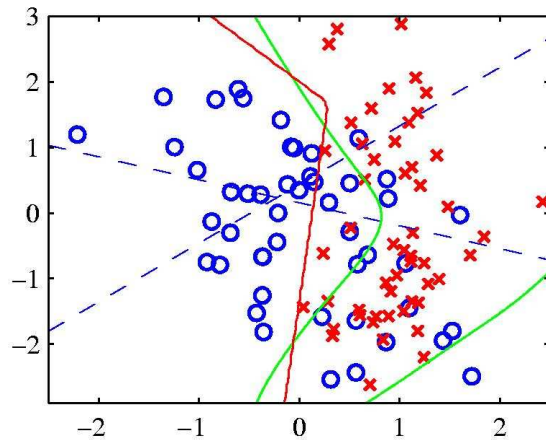
- Linearly separable problems
- XOR Problem
- Why a nonlinear function?
- 2 layers, 4 units

# Multi Layer Networks



# Network Training / Learning

- Classification vs. Regression



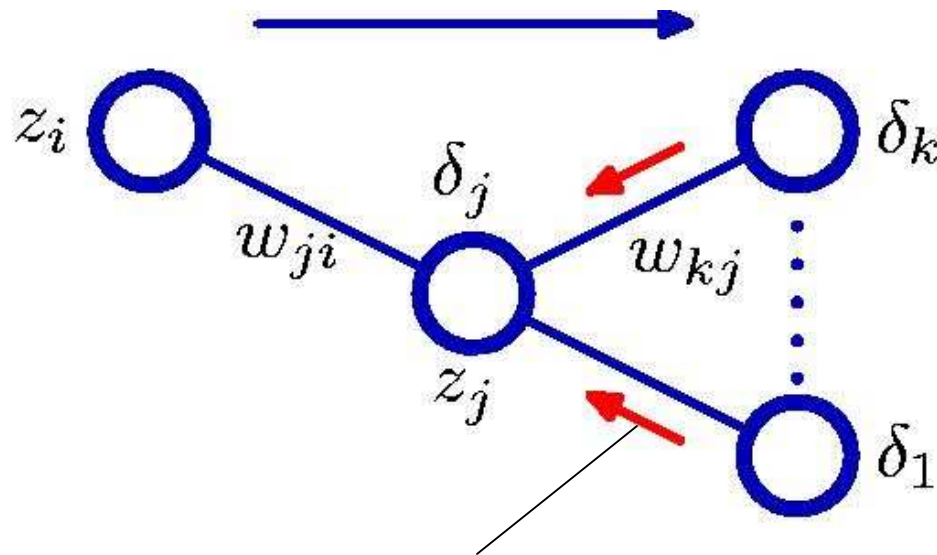
- Batch Learning vs Online Learning

# Learning

- Online Learning
  - weights updated after every training sample
  - significantly faster than offline learning
  - better suited for large datasets
- Offline/Batch Learning
  - weights updated after one epoch

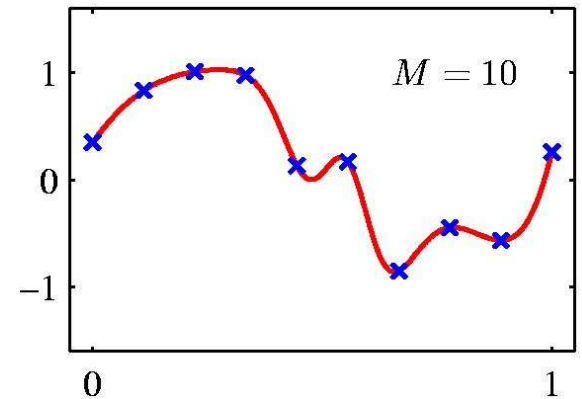
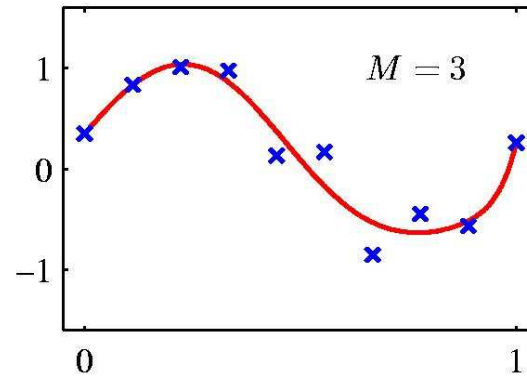
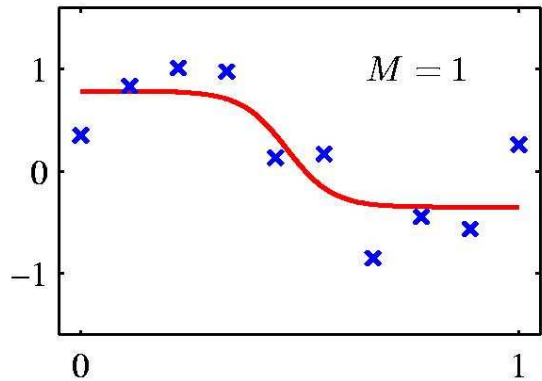
# Backpropagation

## 1. Forward Information Flow



## 2. Errors Propagated Backwards

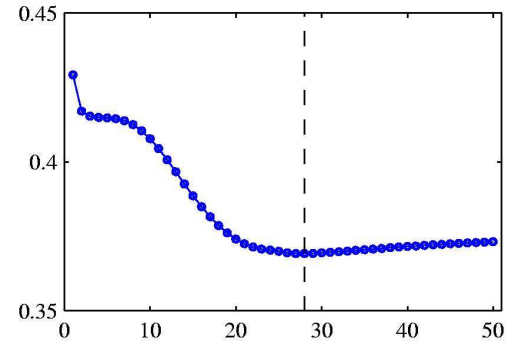
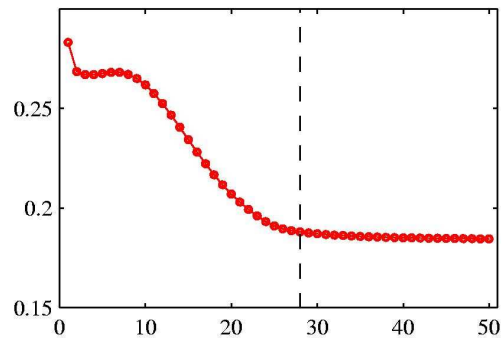
# Regularization



- suitable  $M$  or
- large  $M$ , but regularization  
e.g. early stopping



# Early Stopping



# Invariances

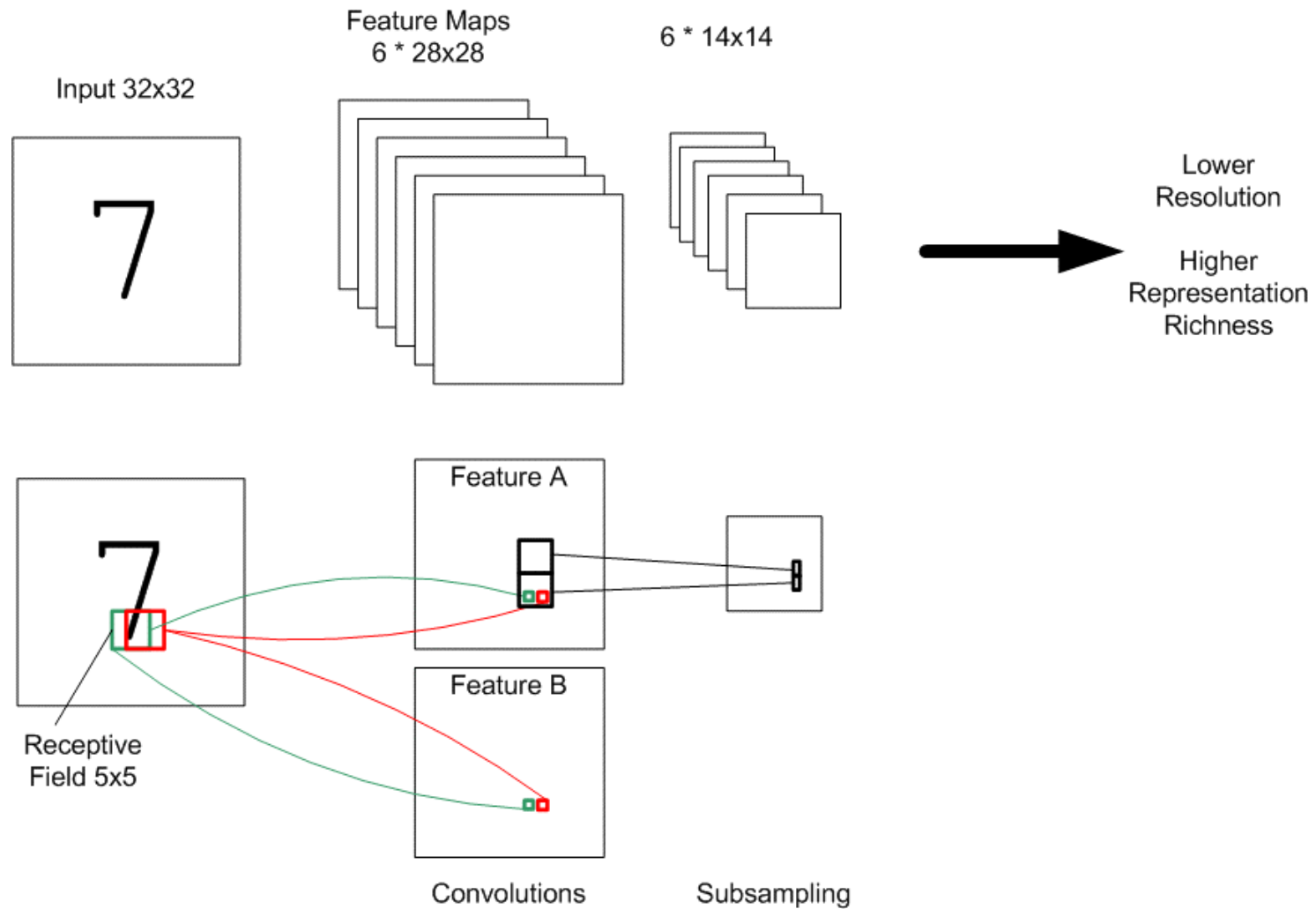
- Same output although some variance in input.

How?

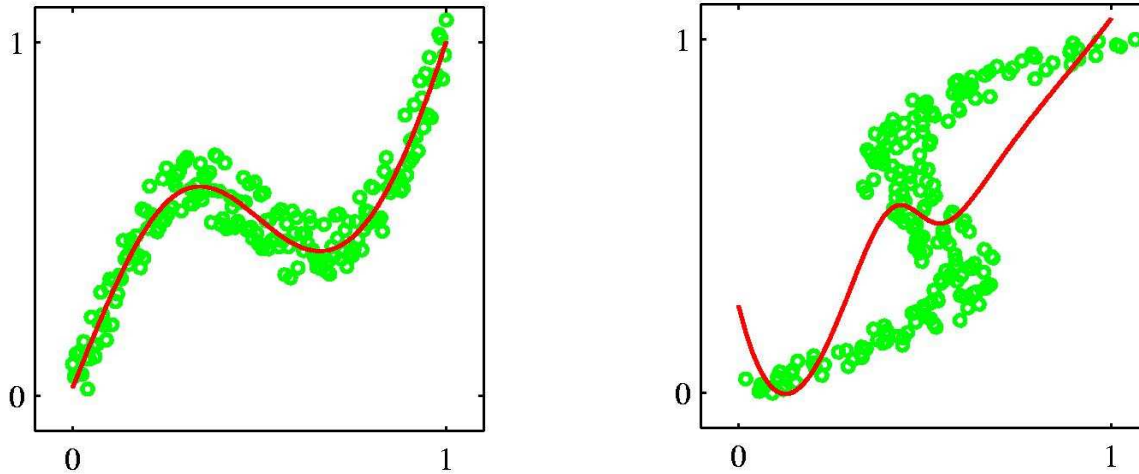
- all examples in training data
- varying copies
- preprocessing
- network itself

-regularization term, receptive fields...

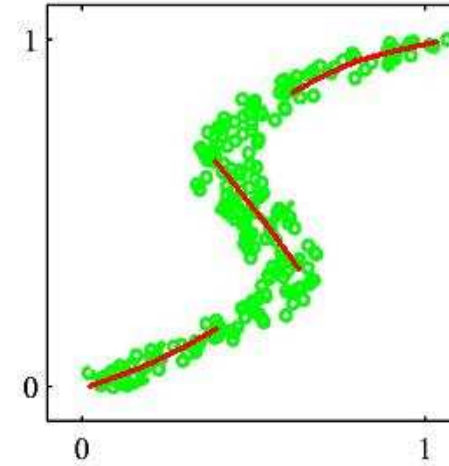
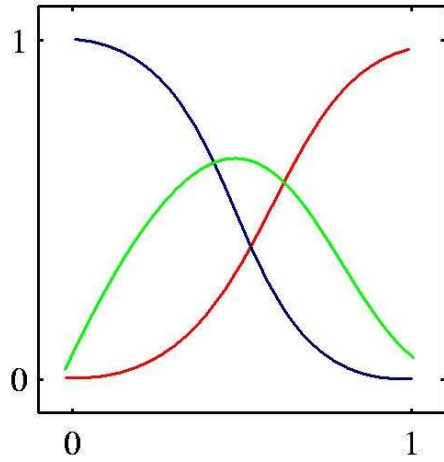
# Convolutional Networks



# Mixture Density Networks



- Gaussian assumption



output:

3 means

3 variances

3 mix. coeff

result

# Questions?

# References

- C. Bishop, *Pattern Recognition and Machine Learning*, Springer, 2006.
- LeNet5 Convolutional Networks  
<http://yann.lecun.com/exdb/lenet/index.html>
- Y. LeCun, L. Bottou, Y. Bengio, and P. Haffner, "Gradient-Based Learning Applied to Document Recognition" *Proceedings of the IEEE*, vol. 86, no. 11, pp. 2278-2324, Nov. 1998.
- S. Haykin, *Neural Networks a Comprehensive Foundation* (2ed), Prentice-Hall, Englewood Cliff, NJ, 1999.
- S. Russell & P. Norvig, *Artificial Intelligence: a modern approach*, (2ed) Prentice Hall, 2003.
- Richard O. Duda, Peter E. Hart, and David G. Stork, *Pattern Classification*, Second Edition, John Wiley & Sons, New York, 2001.