

# Hebbian Equivalence of Backpropagation

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Motivation

Rundown

Current Results

# Motivation of problem at hand

Local Backprop

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Motivation

Rundown

Current Results

- ▶ Preprocessing in olfactory system
- ▶ Dendritic connections
- ▶ Local algorithm vs. backpropagation

# Network explanation

Local Backprop

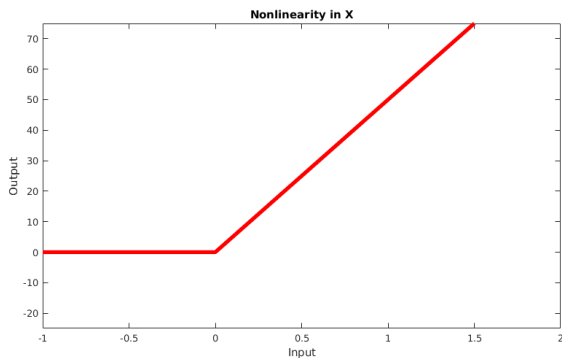
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Motivation

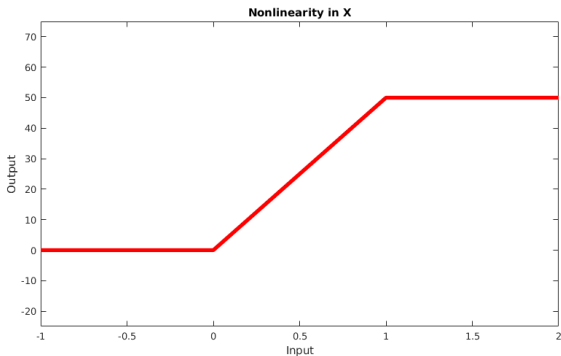
Rundown

Current Results

## ► Rectified Linear Unit



- ▶ Rectified Sigmoidal (or Switching) Unit



# Single layer, 10 digits, results

Local Backprop

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Motivation

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Current Results

- ▶ Learning is happening.

# Single layer, 10 digits, A is fixed; Error

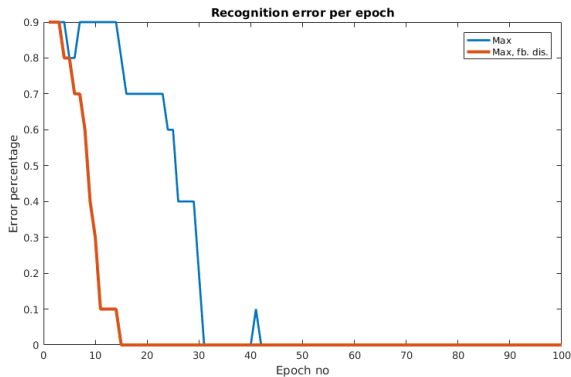
Local Backprop

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# Single layer, 10 digits, A is fixed; Layer Average

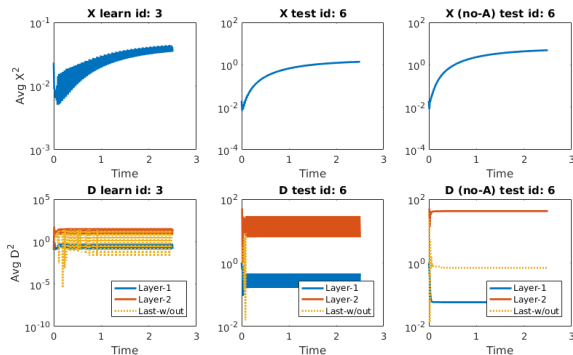
Local Backprop

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# Single layer, 10 digits; Error

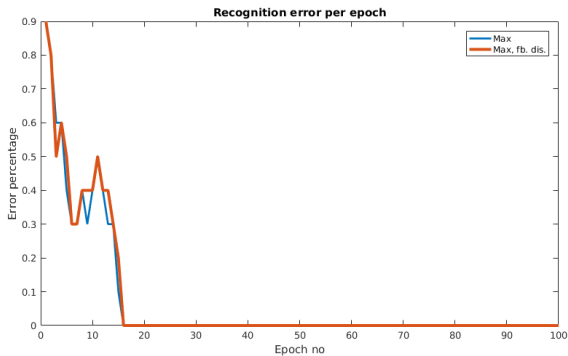
Local Backprop

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# Single layer, 10 digits; Layer Average

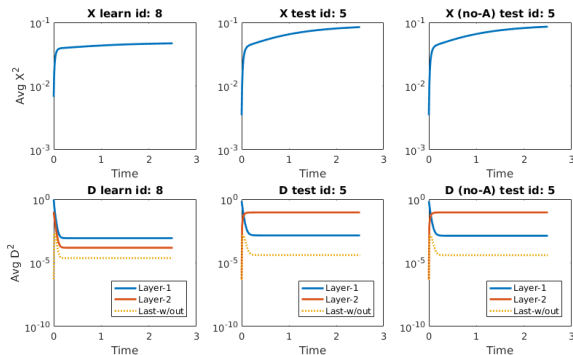
Local Backprop

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# Single layer, entire MNIST dataset, results

Local Backprop

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Current Results

- ▶ Better results when last layer feedback to X is blocked
- ▶ Better results when A layer is fixed to identity
- ▶ Initial hurdle with error rate going up is decreased
- ▶ Biasing rules work, but no improvement over performance
- ▶ ReLU and ReSU similar performance

# Single layer, example; parameters

Local Backprop

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Motivation

Rundown

Current Results

- ▶ A is fixed at identity.
- ▶ Bias is learned
- ▶ Steepness is 10
- ▶ Learning rate is  $5 \times 10^{-8}$
- ▶ Learning rate not adaptive
- ▶ Weight decay is not used
- ▶ Simulation time = 2
- ▶ simulation time steps = 0.007
- ▶ Nonlinearity = ReLU

# Single layer, example; errors

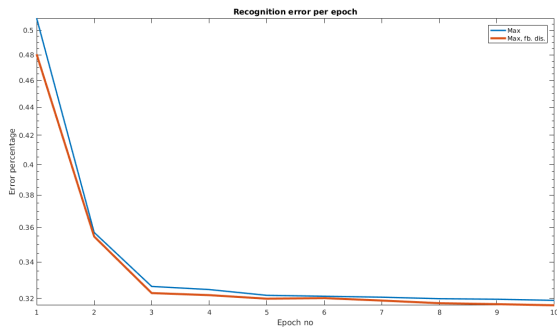
Local Backprop

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Motivation

Rundown

Current Results



# Single layer, example; averages

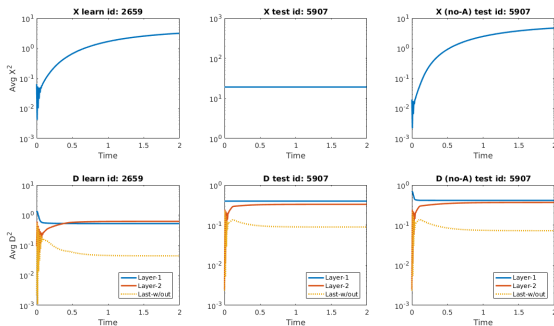
Local Backprop

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Motivation

Rundown

Current Results



# Dual layer, entire MNIST dataset

Local Backprop

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Motivation

Rundown

Current Results

- ▶ Better results when last layer feedback to X is blocked
- ▶ Better results when A layer is fixed to identity