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## MNIST Training for BNN

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Design Your Own CPU - Design of Embedded Systems

## Content

### 1. Neural Networks

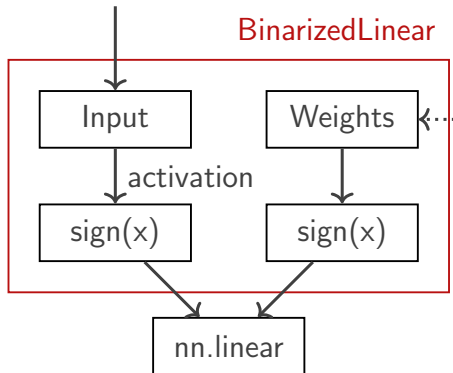
### 2. BNN Design

### 3. BNN Training Analysis

- Layer Analysis
- Parameter Analysis

## Binarisation of Linear Layer

- binarisation of weights
- binarisation of input data for hidden layers
- calculation through *nn.linear*



## Activation

Inhalt...

## Batch Norm (BN)

- In NN

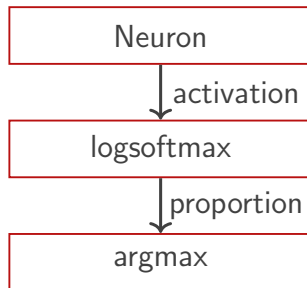
- normalize batches
- mean 0
- standard derivation 1

- In BNN

- prevent *expolding gradient*

## Evaluation of last layer

- normalisation of activation
- decision of the network



## 1. Neural Networks

## 2. BNN Design

## 3. BNN Training Analysis

- Layer Analysis
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## Consequences of linear layer binarisation

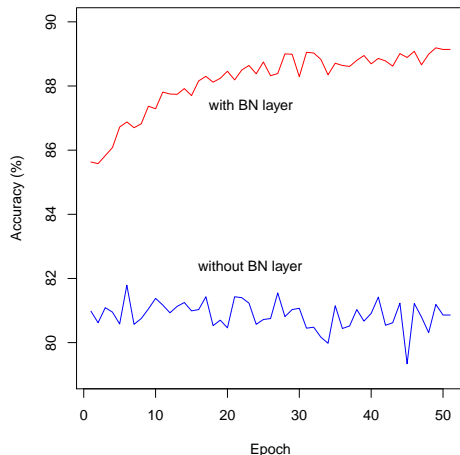
Run	binary	normal
1	<b>88.29%</b>	<b>97.43%</b>
2	87.32%	96.98%
3	87.19%	97.2%

- training for 50 epochs
- mean loss of 9,6%
- loss in granularity



## Effect of Batch Norm

- 7.4% improved peak performance
- Less jitter with BN
- Reduced exploding gradient



## learning rate

- higher value  $\rightarrow$  more weights are updated
- balance between over- and underfitting

## evaluation learning rate

