Neural Network Nearest-Neighbour Transformation for Segmentation of Retinal Blood Vessels

**Bachelor's Thesis Introductory Talk** 

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- Motivation
- Introduction
- Method
- Process







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### **Fundus Photography**

- important modality for examining eye
- diagnosis of diseases (e.g. glaucoma, diabetic retinopathy)
- segmentation supports computer-aided diagnosis



[DRIVE database]



#### **Neural Networks**

#### • good performance in computer vision tasks





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#### **Neural Networks**





#### **Convolutional Neural Networks**



- inputs are images
- learnable filters
- parameter sharing  $\rightarrow$  less parameters to train
- neurons not fully connected



#### **Convolutional Neural Networks**



1<sup>st</sup> hidden layer



2<sup>nd</sup> hidden layer [Zeiler & Fergus, 2013]



3<sup>rd</sup> hidden layer

• each following layer detects more abstract features



#### **Neural Networks - Problems**

- image transform too complex for network to learn explicitly
- underfitting effects
- overfitting effects
- complex/deep network hard to train (local minima)



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## N<sup>4</sup>-Fields

#### N<sup>4</sup>-Fields: Neural Network Nearest Neighbor Fields for Image Transforms

Yaroslav Ganin, Victor Lempitsky Skolkovo Institute of Science and Technology (Skoltech)

- architecture for natural edge detection/thin object segmentation
- neural network and nearest-neighbour search applied sequentially
- process images patch-by-patch



# N<sup>4</sup>-Fields



- run patch through convolutional neural network
  - $\rightarrow$  receive neural code
- compare with dictionary entries through nearest-neighbour search
  - $\rightarrow$  retrieve output patch
- average all output patches to segmented image



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#### Process

- train convolutional neural network (GPU)
- evaluate on DRIVE database
  - = digital retinal images for vessel extraction

### • Play with it!

- $\rightarrow$  adjust hyperparameters (learning rate, regularization, ...)
- $\rightarrow$  try to improve performance



# Thank you for your attention!





**TECHNISCHE FAKULTÄT** 



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### References

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