

Explainable image segmentation with wavelet-network

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Motivation

Reliability

- Safety critical domains \Rightarrow reliable model
- Reliability can be achieved by introducing self-explainable models
 - prototype \Rightarrow basis of the explanation
 - feature extraction \Rightarrow large convolutional neural networks \Rightarrow random and memory demanding
- WaveProtoPNet
 - Wavelets \Rightarrow feature extractors
 - Promising results in image classification
 - Can we use the system for **segmentation**?

Wavelet transform

Wavelets

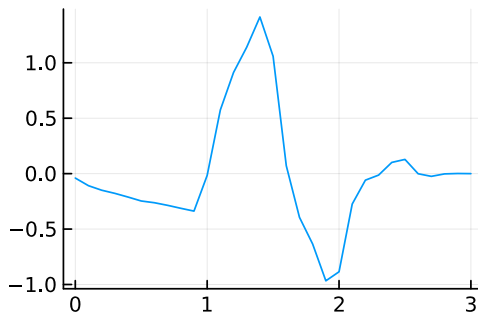


Figure: Daubechies-2 wavelet

- It is similar to the Fourier transform, but keeps information about both time and frequency components of the function.

Wavelet-decomposition

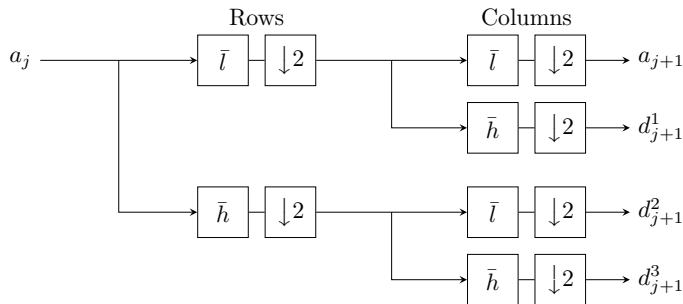


Figure: 2 dimensional fast wavelet transform

- wavelet - can be built up from high- and low-pass filters
- fast wavelet transform - with the filters
- result: 4 quarter-sized image
- reconstruction similarly

WaveProtoSeg

Starting point: WaveProtoPNet modell

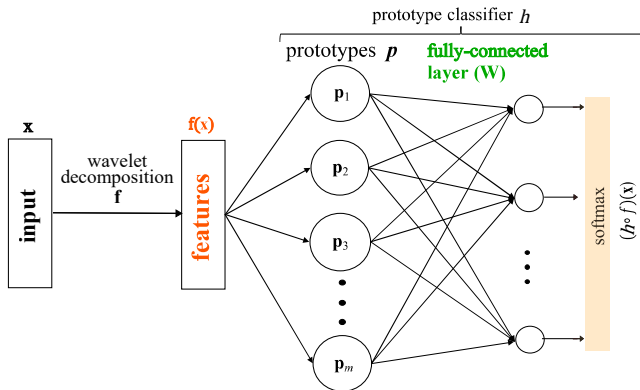
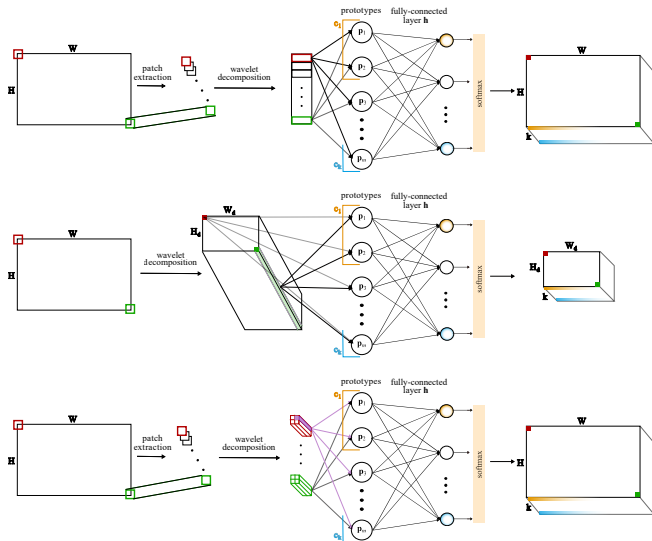


Figure: Structural parts of WaveProtoPNet.

Segmentation model: WaveProtoSeg



Implementation approaches:

- ➊ Patch extraction at the beginning + patch-sized prototypes.
- ➋ Patch extraction via wavelet decomposition.
- ➌ Patch extraction at the beginning + prototypes smaller than the size of a patch

Experiments

Dataset



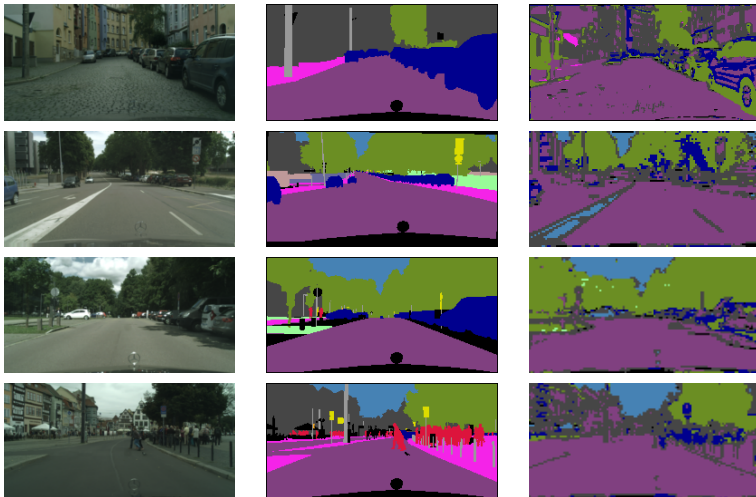
Cityscapes dataset

- 20 classes
- 5000 images
- 128×256 RGB

Results

- Best result:
 - 3. modell type,
41.19% **train** and 39.21% **test** mIoU (mean Intersection over Union)
- Faster but less accurate:
 - 2. modell type,
35.43% **train** and 33.86% **test** mIoU

Classification - example



Prototypes

20 prototype/class



5 proto/class



- Only a few classes yield representative prototypes; the others are mostly noisy.

Conclusions, future work

Conclusions, future work

- Low mIoU
 - underrepresented classes
 - wavelet decomposition is not sensitive enough to the data
 - small receptive field
- It would be worth trying on another data set
- Using the results of wavelet decomposition from multiple levels

Questions?

Bibliography I

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- [4] Wojciech Samek et al. “Explaining Deep Neural Networks and Beyond: A Review of Methods and Applications”. In: *Proceedings of the IEEE* 109 (Mar. 2021), pp. 247–278. DOI: 10.1109/JPROC.2021.3060483.