

# TRAINABLE V4-LIKE FILTERS

## FOR DETECTING RETINAL VASCULAR BIFURCATIONS

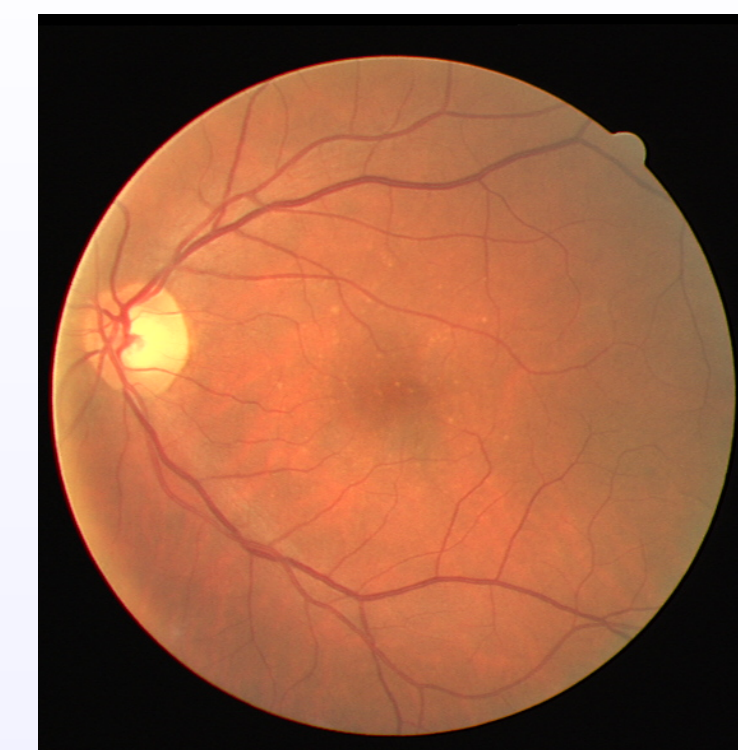
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### Abstract

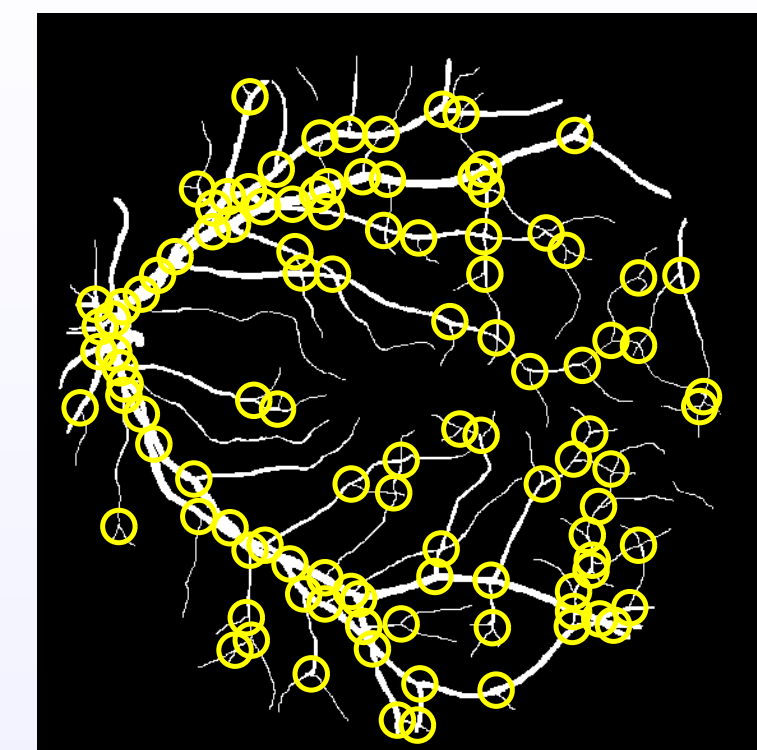
We propose a novel method to detect vascular bifurcations in retinal fundus images. Our method is implemented in trainable filters that mimic the properties of some neurons in area V4 of visual cortex. Such a filter is configured by combining given channels of a bank of Gabor filters using an AND-type operation. Their selection is determined by an automatic analysis of a user-specified feature. With only 25 filters we report a recall rate of 98.52% at a precision rate of 95.19% on 40 images.

### Motivation

To automate a time consuming manual process



Retinal fundus image



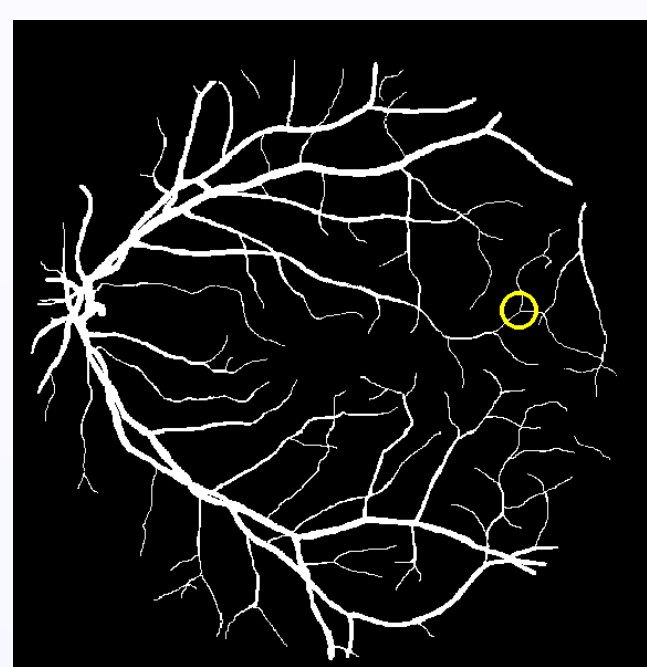
Marked bifurcations

### Method: Filter configuration

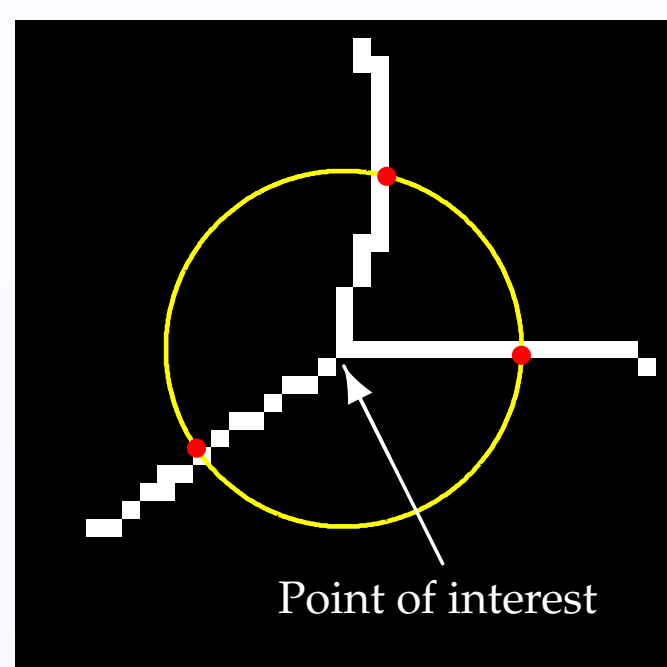
#### a. Automatic analysis of a specified feature

Extract information about:

- Dominant oriented line segments (red markers) around the point of interest



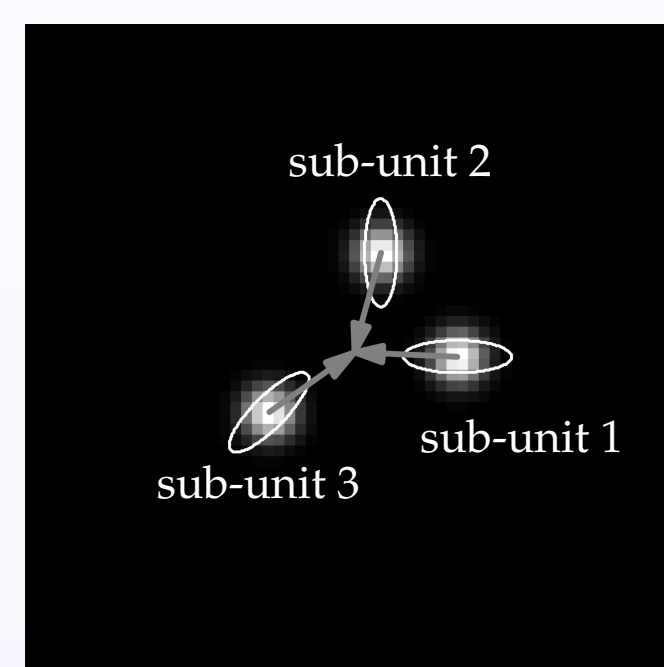
User selects a feature



Selected feature

#### b. Configuration of sub-units

Sub-units: detectors of line segments

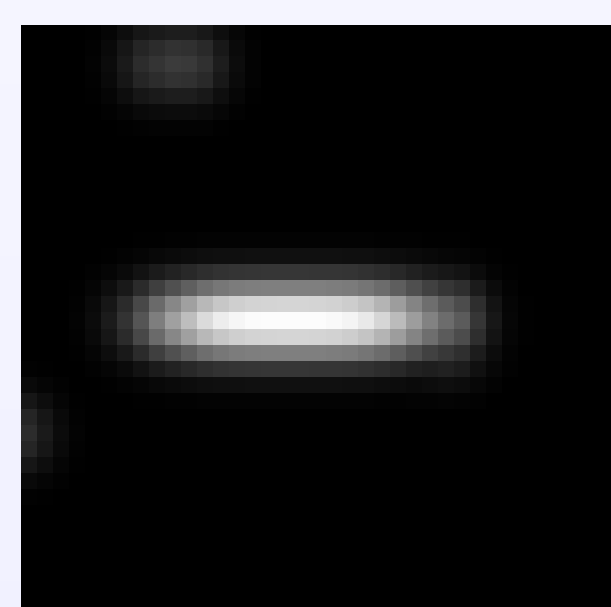


Configured sub-units

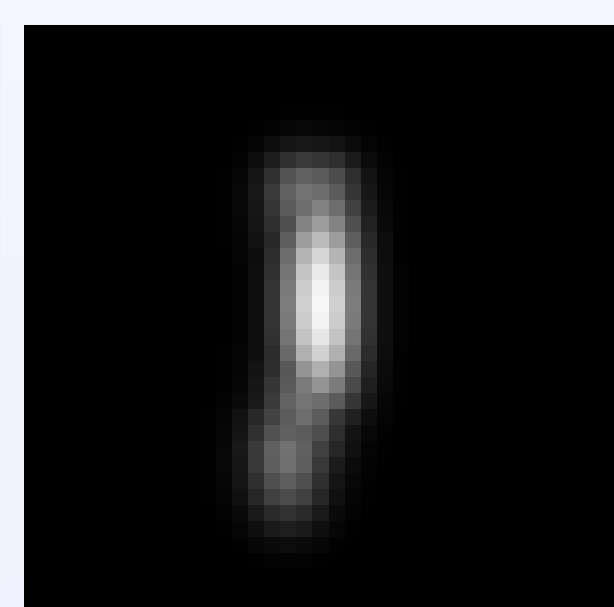
Computation of a sub-unit output at position  $(x, y)$ :

1. Filter image with a **Gabor filter** (bright ellipse) of preferred orientation and wavelength
2. **Weight** the responses of the Gabor filter with a **Gaussian function** (circular blob) centered at  $(x, y)$
3. Output is the **maximum** value of the weighted responses, **shifted** in the direction of the arrow

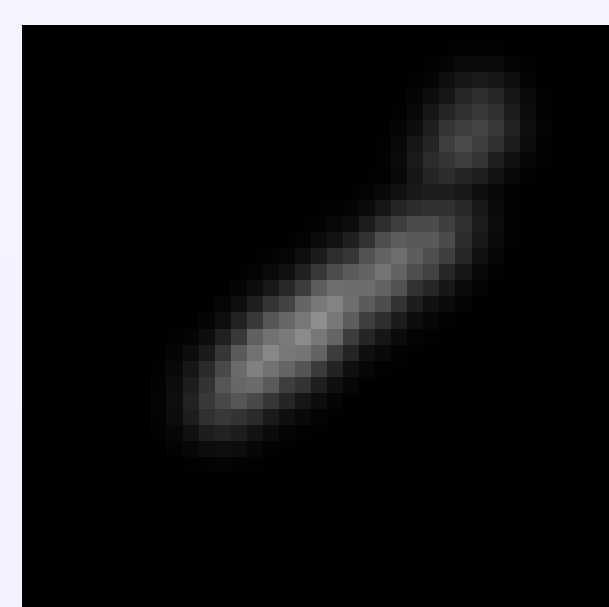
#### c. Combine sub-unit responses



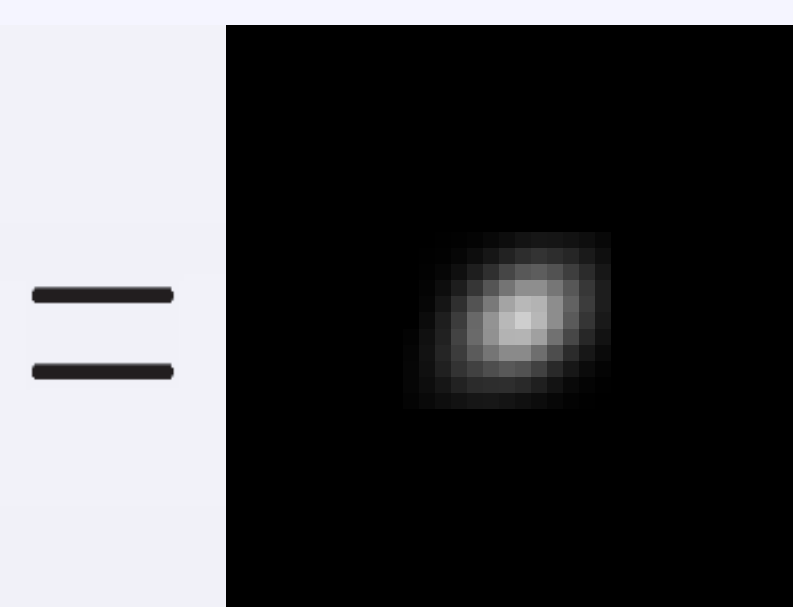
Sub-unit 1 output



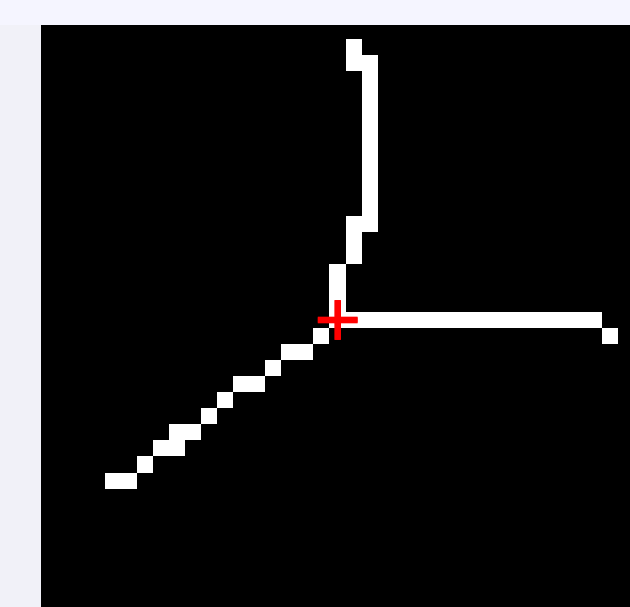
Sub-unit 2 output



Sub-unit 3 output



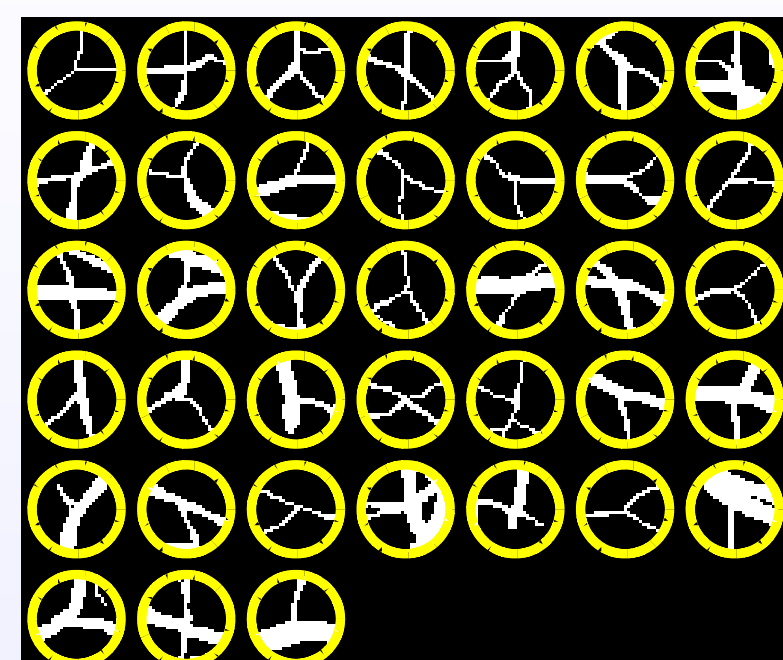
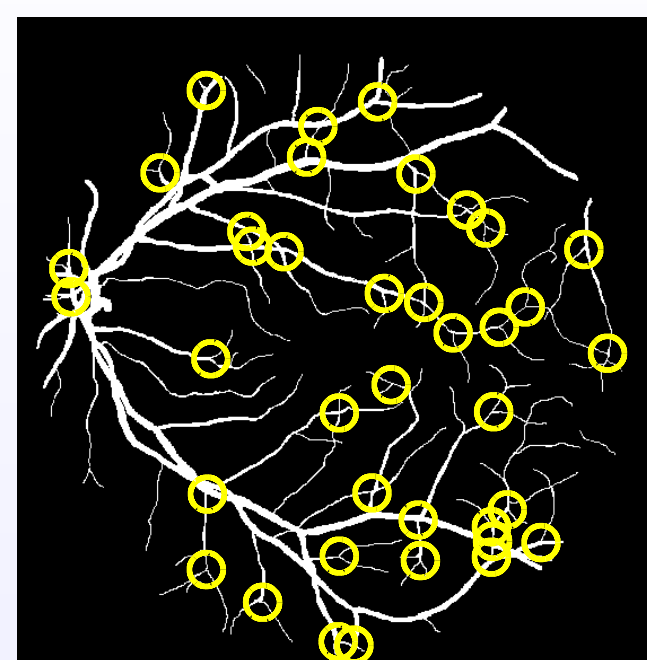
Filter output



Local maximum

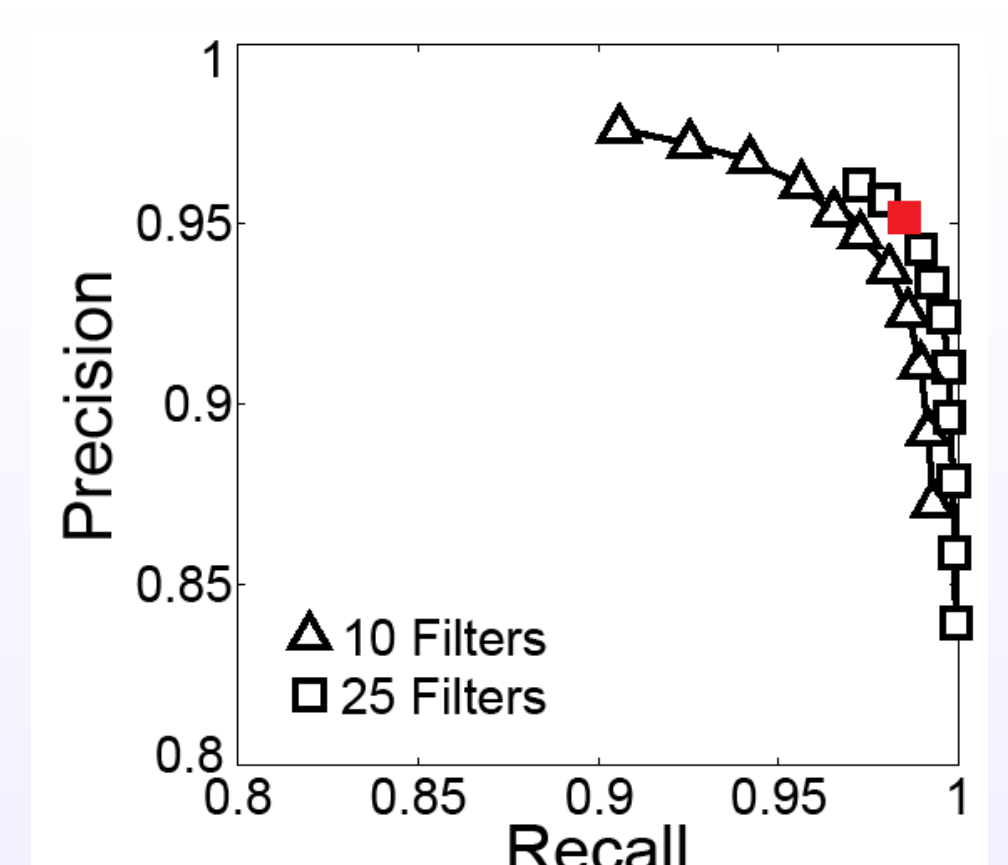
### Filter application example

A single filter detects 38 out of 107 bifurcations



### Results

- **Dataset:** 40 binary images from the DRIVE dataset [1]
- **Results**
  - Recall rate: 98.52%
  - Precision rate: 95.19%



### Conclusion

- **Effective** for the concerned medical application
- **Trainable filters** can be used in various applications

### Reference

- [1] Staal J., Abramoff M.D., Niemeijer M., Viergever M.A., van Ginneken B., Ridge-based vessel segmentation in color images of the retina, in *IEEE Transactions on Medical Imaging*, 2004