



## Abstract

The capillary network in the retina can be readily imaged using a normal fundus camera, therefore its analysis may provide an early warning about serious cardiovascular diseases. An important sign is the **generalized arteriolar narrowing**, usually expressed by the **Arteriolar-to-Venular diameter Ratio (AVR)**.

The current procedure requires **long** and **cumbersome manual measurements**. I developed an objective, fast and user-friendly **computerized system** to quantitatively assess these **vascular parameters** in retinal images

## Purpose

- An important sign of retinopathy is the **generalized arteriolar narrowing**, usually expressed by the Central Retinal Arteriolar Equivalent (CRAE), the Central Retinal Venular Equivalent (CRVE) and the **Arteriolar-to-Venular diameter Ratio (AVR=CRAE/CRVE)**.
- The current procedure requires **long** and **cumbersome manual measurements** (about 15 minutes per image using the IVAN system).
- I developed a **computerized system** to quantitatively assess the **vascular parameters** in retinal images in an objective, fast and user-friendly way.

## Methods

- The first, totally **automated phase** performs image luminosity equalization and contrast enhancement, tracing of the vascular network with vessel caliber estimation, vessel map identification, vessel classification as either arteries or veins.
- In the second, **computer-aided phase**, users evaluate the results provided and confirm them or apply the needed corrections via a user-friendly editing interface. The vascular parameters are eventually computed.

- Image enhancement:** provides contrast and luminance uniformity both intra- and inter-image [1].
- Vessel axis detection:** starting from a set of seed points, optimal cost paths are extracted to connect them [2].
- Vessel caliber estimation:** diameters are extracted by a fast 1-dimensional matched filter technique [3]
- Vessel map identification:**
  - segments belonging to the same vessel are linked using caliber, color, direction and closeness informations
  - bifurcations (yellow circles in figure) and crossing points (red circles in figure) are detected

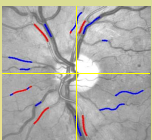


### Probabilistic multiclassification

A double probability to be vein is assigned to each vessel:

**Red values of central axis samples** (mean and variance-grater in arteries- in a sample neighbourhood)

- unsupervised classification
- fuzzy-C-mean
- image subdivision into four quadrants

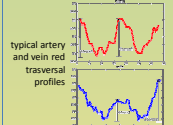


Vein probability for each vessel:

$$P_v = \frac{R_v}{R_v + R_a}$$

$n_v$ = pixels classified as vein  
 $n_a$ = pixels classified as artery

**Central axis reflex** (mean value along a vessel of central peak in red channel transversal profile - grater in arteries)



A sigmoidal probability function is calculated for each different image: a vessel with a probability greater than 0.5 is considered as a vein



True veins are in blue, true arteries in red, a classification error is present for vessel nr.40

Mean probability between the two methods is calculated, then adjusted to satisfy these constraints:

- at least six arteries and six veins are present
- at crossings, vessels belong to different classes

### AUTOMATED

Vessel tracing

Artery/Vein Classification

- CRAE
  - CRVE
  - AVR
- computing

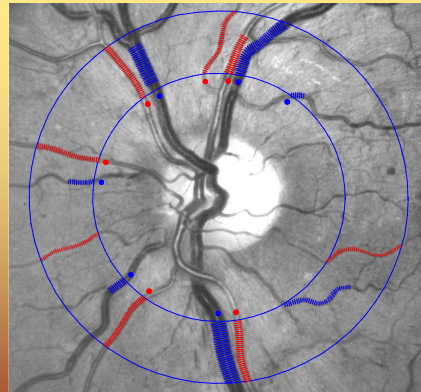
### COMPUTER-AIDED

Optic Disc placement

Vessel tracking editing

New vessel adding

Classification correction



Only diameters of the 6 major arteries and the 6 major veins (vessels with red/blue dots) are used. Parameters are calculated using the Knudtson formulas.

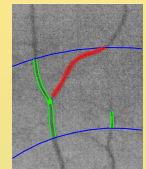
CRAE 149.10  
CRVE 304.94  
AVR 0.49

### Graphical User Interface

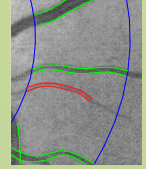
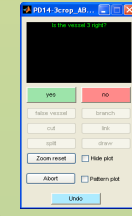
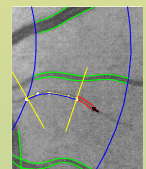
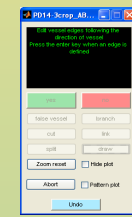
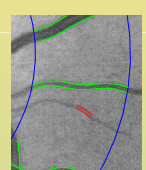
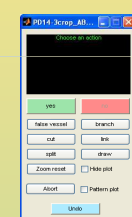
The computer-aided procedure **guides** users in problematic situations and **suggests** the more principled operations to be accomplished (1).

Users have **complete freedom** to edit on their own every critical situation (2).

- Bifurcation** (AVR formulas by Knudtson consider only trunks diameters)



- Tracking editing** (e.g. in the case of under-segmentation)



## Results

- Repeatability** of the complete system was assessed by having three trained users independently analyze **20 DCCT** and **18 ETDRS** images.
- The average time required to analyze one image is 4 min (range 2-6 min).

	CRAE	CRVE	AVR
User A	-	0.96	0.92
User B	0.96	-	0.96
User C	0.92	0.96	-

	CRAE	CRVE	AVR
User A	-	0.97	0.98
User B	0.97	-	0.96
User C	0.98	0.96	-

	CRAE	CRVE	AVR
User A	-	0.97	0.97
User B	0.97	-	0.98
User C	0.97	0.98	-

	CRAE	CRVE	AVR
User A	-	0.97	0.94
User B	0.97	-	0.94
User C	0.94	0.94	-

	CRAE	CRVE	AVR
User A	-	0.98	0.99
User B	0.98	-	0.98
User C	0.99	0.98	-

	CRAE	CRVE	AVR
User A	-	0.98	0.97
User B	0.98	-	0.97
User C	0.97	0.97	-

Inter-user correlation on ETDRS images

## Discussion

- Vascular parameters estimated by the proposed system were compared with those obtained on the same images by using the IVAN system (University of Wisconsin).
- Very good correlation** between the two systems:

	CRAE	CRVE	AVR
DCCT	0.85	0.84	0.91
ETDRS	0.90	0.91	0.94

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Correlations with IVAN on DCCT and ETDRS datasets

- The implementation of the system as **web-based service** is under development.

### References:

- [1] M. Foracchia, E. Grisan and A. Ruggeri, "Luminosity and contrast normalization in retinal images," Med Image Anal, vol. 9, pp. 179-90, 2005.
- [2] E. Poletti, D. Florin, E. Grisan, A. Ruggeri, "Retinal Vessel Axis Estimation through a Multi-Directional Graph Search Approach", World Congress 2009 in Medical Physics and Biomedical Engineering, 7-12 September, Munich (DE)
- [3] D. Florin, E. Poletti, E. Grisan, A. Ruggeri, "Fast adaptive axis-based segmentation of retinal vessels through matched filters", World Congress 2009 in Medical Physics and Biomedical Engineering, 7-12 September, Munich (DE)