

# Tortuosity measurements



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# Outline



- Introduction
  - Tortuosity measurements
- measurements
  - Arc Length Over Chord Length Ratio
  - $t_c/t_{sc}$  over Arch length/Chord Length
  - Mean direction Angle Change
  - Inflection Count Metric
  - Proposed method of the article
- Summary

# Introduction



## ■ Based on article:

- A Novel Method for the Automatic Grading of Retinal Vessel Tortuosity
- Enrico Grisan, Marco Foracchia, and Alfredo Ruggeri
- IEEE TRANSACTIONS ON MEDICAL IMAGING, VOL. 27, NO. 3, MARCH 2008

## ■ Requirements:

- For an automatic measurement a segmentation and thinning algorithm is needed

# Arc Length Over Chord Length Ratio (implemented)



- **Chord Length:**
  - Distance of end points ( $L_x$ )
- **Arc Length:**
  - The real length of the curve ( $L_c$ )
- **Measurement:**
  - The tortuosity is the ratio of the 2 lengths
- **Problems:**
  - A curved, but not tortuous vessel can have a high value too
  - Highly depends on amplitude, and low dependency on frequency



# Measures Involving Curvature (implemented)

## ■ Definitions:

- $s(l)$  is the curved line
- $tc$  is absolute curvature
- $tsc$  is squared curvature

## ■ Measurements:

- The ratio of  $tc/tsc$  and the arc/chord length

$$s(l) = [x(l), y(l)] : D \subset \mathbb{R} \rightarrow \mathbb{R}^2$$

$$\kappa(l) = \frac{\frac{dx}{dl} \frac{d^2y}{dl^2} - \frac{d^2x}{dl^2} \frac{dy}{dl}}{\left( \left( \frac{dx}{dl} \right)^2 + \left( \frac{dy}{dl} \right)^2 \right)^{3/2}}$$

$$tc = \int_{\min(D)}^{\max(D)} |\kappa(l)| dl$$

$$tsc = \int_{\min(D)}^{\max(D)} |\kappa(l)|^2 dl$$

# Derivative of Curvature (implemented)



- Measurement:
  - Integral of the squared derivative of curvature

$$\text{DCI} = \frac{1}{L_c} \int_{\min(D)}^{\max(D)} \left| \frac{d\kappa(l)}{dl} \right|^2 dl.$$



# Mean direction Angle Change (not implemented yet)

## ■ Definitions:

- $d_i$ : coordinates of the  $i$ th samplepoint
- $v_{i+n}$  ( $v_{i-n}$ ): A vector from the  $i$ th sample point to the „ $i+n$ “th ( „ $i-n$ “th ) sample point

$$\mathbf{v}_{i+n} = \mathbf{d}_{i+n} - \mathbf{d}_i$$

$$\mathbf{v}_{i-n} = \mathbf{d}_{i-n} - \mathbf{d}_i$$

$$\theta(i) = \arccos(\mathbf{v}_{i+n} \cdot \mathbf{v}_{i-n})$$

$$MAC = \frac{1}{N - 2 \cdot n} \sum_{i=1}^n \theta(i)$$

# Inflection Count Metric (implemented)



## ■ Measurement:

- Arc length over chord length value multiplied by the „number of inflection points + 1“



# Proposed method of the article (not implemented yet)



## ■ Measurement:

- They segment the curved line into  $n$  segments with constant curvature (using an unknown algorithm) and summarize them using the equation to the right.

$$\tau(s) = \frac{n-1}{n} \frac{1}{L_c} \sum_{i=1}^n \left[ \frac{L_{c_{s_i}}}{L_{\chi_{s_i}}} - 1 \right].$$

# Summary



- No ground-truth for tests
- Raster images generate not existing curvature changes
- No solution for bifurcations and vessel crossings