

Maysa M. G. Macedo<sup>1</sup>, Choukri Mekkaoui<sup>2</sup>, Marcel P. Jackowski<sup>1</sup> <sup>1</sup>Institute of Mathematics and Statistics, Computer Science Department, University of São Paulo, Brazil

<sup>2</sup>Harvard Medical School, Massachusetts General Hospital, Athinoula A. Martinos Center for Biomedical Imaging, Charlestown, MA, USA

#### e-mail: maysa@ime.usp.br

# Introduction

- An increasing demand for sophisticated tools to characterize the integrity and functional state of vascular networks from different imaging modalities has emerged.
- Currently available tools are time-consuming and limited in their ability to assess the state of vascular architectures,
- There is a need for developing robust and fast computer-based techniques for extracting vessel trajectories as well as estimate their diameters.

### Purpose

To investigate a technique based on the well-known Hough Transform (HT) to dynamically estimate the trajectory and vessel diameter without resorting to time-consuming multiscale techniques [1].

### Methodology

proposed tracking method The consists of successive executions of the above steps to extract a vessel trajectory [2].

#### **1.Initialization**

The tracking method starts by the selection of a seed point in an image plane perpendicular to the vessel tangent.

#### 2. Preprocessing

- Anisotropic Diffusion filtering
- Morphological Opening and Subtraction operation
- Edge detection using Canny filter

#### 3.Tracking

- Compute vessel scale information using HT.
- The vessel direction is computed from Hessian matrix as in [3].
- The direction t defines the normal vector to the next extraction plane and  $t_{1,1}$  the previous one.

 $\vec{t}_i = signal(\vec{e}_1 \cdot \vec{t}_{i-1})\vec{e}_1$ 

#### 4.Bifurcation Analysis

- Each vessel cross-section contour is extracted and represented as a spline.
- From these splines, curvature-based measures are computed for detecting the bifurcation points.



Fig. 1 (A) Ellipsoidal field representing the Hessian information throughout a synthetic vessel segment. Green rectangle indicates the cross-section for depiction of image structure in vessel locations. (B) Vessel exterior, interior and boundary representation by Hessian-based ellipsoidal field.

# **TOWARDS ROBUST AND FAST VESSEL EXTRACTION FROM MRA IMAGES**

### **Scheme Overview**





Fig. 2 (A) Flowchart of the methodology. (B) Cartoon depiction of the orthogonal plane extraction in absence and presence of bifurcations.

# Results

- The methodology has shown to work well under significant amounts of noise using the synthetic dataset with high curvature trajectory and with several branches.
- Synthetic vessel images: resolution of 1mm<sup>3</sup> and size 128x128x128.
- MRA of a human brain was acquired on a 3.0T scanner using a T1-FFE sequence with TR/TE=25/3.15ms, with resolution 0.39x0.39x0.5mm<sup>3</sup> and size 512x512x290.
- For our set of synthetic images, the average distance to the groundtruth centerlines is 1.5 mm.



Fig. 3 (A) Sinusoidal synthetic vessel image without noise and with increasing levels of Gaussian noise ( $\sigma$ ) combined with tracking results. (B) Synthetic bifurcation image without noise and with increasing levels of Gaussian noise ( $\sigma$ ) combined with tracking results.



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Fig. 4 (A) Synthetic sinusoidal tracking result. (B) Synthetic tree-like tracking result. (C) Brain MRA dataset and results from tracking a carotid segment. (D) Cross-section curvature analysis of (A). (E) Cross-section analysis of (B). Locations P1 and P2 indicate bifurcation points.

### Conclusions

- We have proposed a semi-automated method to detect and track vessel trajectories in MRA.
- The novelty of this study is the use of HT to define the seed point for tracking and detecting the vessel scale without resorting to multiscale analysis technique.
- In spite of presence of noise, a mean diameter can be established.
- Future work will focus on automatic bifurcation handling using analysis of curvature of the vessel profile at the cross-section.

### References

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