

An automatic tool for thoracic aorta segmentation and 3D geometric analysis

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Introduction

The aorta

- **main artery** of the human body, it carries oxygenated blood to all parts of the body
- common pathology of the thoracic aorta are: thoracic aortic aneurysm (TAA) and thoracic aortic dissection of type B (TBAD)
- deformation of the vessel with risk of rupture





Introduction

Surgical treatment

- treated with endovascular technique: thoracic endovascular aortic repair (TEVAR)
- the procedure involves the placement of an expandable stent-graft: metallic mesh covered with a dacron skirt
- no need of open surgery
- TEVAR for TBAD is increasing rapidly



Introduction

Background

the thoracic aorta is a pulsatile environment and experiences high hemodynamic forces



ECG-Gated CTA w\o stent

ECG-Gated CTA w\o stent

ECG-Gated CTA w\ stent

Drawbacks

- long term durability not established yet
- side branches revascularization need to be addressed

Aims of the work

AIMs:

- clarify the **role of stent-graft** on aortic elasticity in a pulsatile environment
- robust, repeatable, and quantitative analysis
- analysis of both circumferential and longitudinal aortic changes
- improve stent-graft design and durability

Tool for thoracic aortic analysis:

- set of methods, automatic
- minimum user interaction
- quantitative geometric features extraction

The tool has been **developed** exploiting Python programming language and the libraries: The Visualization Toolkit (VTK) and The Vascular Modelling Toolkit (VMTK)

State of the art

- several studies investigated the dynamic of the aorta [VanP2009] [VanK2009] [muhs2006]
- no 3D model segmentation
- manual selection of 2D cross-sections orthogonal to the vessel
- computed only diameter or area changes
- found that mean diameter change is 2-20% and is preserved after TEVAR for TAA²





The dataset

- 4D computed tomography angiography (CTA) → images the aorta with contrast medium during time
- ECG-gated
- 8 CTA images covering the entire hearth cycle
- possibility to gather **aortic dynamic changes**



ECG-Gated CTA



8 CTA images



Tool outline

- 1. Image pre-processing
- 2. Automatic segmentation of 4D CTA
- 3. Pre- post-TEVAR surface registration
- 4. Outer contour lines computation
- 5. Levels of interest detection
- 6. Measurements



ECG-Gated CTA



8 CTA images



- I(**x**) is a scalar field of gray levels, with $\mathbf{x} \in \mathbb{R}^3$
- I(x) is composed of voxels



Image convolved with a kernel \rightarrow (2k+1, 2l+1, 1)

- ✓ Median filtering
 - Intensity of each Pixel_{out}: median of intensity of pixels_{in} covered by the kernel
 - No edge blurring



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Segmentation: edge based segmentation approach is exploited

Edge detection: set of mathematical methods

Aim \rightarrow identifying points at which the image brightness changes sharply

Type \rightarrow search based

compute the magnitude of the image gradient and search for local directional maxima (gradient direction)

$$\nabla I = \begin{pmatrix} G_x \\ G_y \\ G_z \end{pmatrix} \begin{pmatrix} \partial I / \partial x \\ \partial I / \partial y \\ \partial I / \partial z \end{pmatrix}$$

Smoothing is suggested before edge enhance



Segmentation

- based on implicit models → level set
- the scalar surface $S\left(\mathbf{y},t
 ight):\mathbb{R}^{2}\times\mathbb{R}^{+}\rightarrow\mathbb{R}^{3}$
- is described as a signed distance function $\Phi(\mathbf{x},t): \mathbb{R}^3 \times \mathbb{R}^+ \to \mathbb{R}$
- its iso-surface of level zero is the 3D model of interest $S(\mathbf{y},t) = \{\mathbf{x} | \ \Phi(\mathbf{x},t) = 0\}$

Signed distance function

$$\Phi(\mathbf{x},t) = \begin{cases} -D(\mathbf{x}) & \text{if } \mathbf{x} \text{ is inside } S, \\ +D(\mathbf{x}) & \text{if } \mathbf{x} \text{ is outside } S, \\ 0 & \text{if } \mathbf{x} \in S, \end{cases}$$

where

$$D(\mathbf{x}) = \min_{\mathbf{y} \in S} \{ ||\mathbf{x} - \mathbf{y}| \}$$

Segmentation: 3D surface is computed solving the evolution equation in \varPhi [antiga2008]

$$\Phi_t = -w_1 G(\mathbf{x}) \|\nabla \Phi\| + 2w_2 H(\mathbf{x}) \|\nabla \Phi\| + w_3 \nabla P(\mathbf{x}) \cdot \nabla \Phi$$

where:



weights w_1 , w_2 , and w_3 guide the influence of each term on the surface evolution

Initialization

• the level set has to be **initialized** with an initial $\varPhi_0(\mathbf{x}) = \varPhi(\mathbf{x},0)$

Automatic segmentation of 4D CTA

Segmentation: colliding front initialization^[antiga2008]

- the user puts **two** seeds inside the vessel
- a wave propagates between the seeds and generate the initial $\phi_0(\mathbf{x})$

$$\|\nabla T_i\| = \frac{1}{1 + I(\mathbf{x})}$$

$$\Phi_0(\mathbf{x}) = \nabla T_1 \cdot \nabla T_2$$
 •

- travel time of a wave originating from a seed and traveling with velocity I(x) → faster where the image is brighter
 - negative where the two waves travel in opposite directions positive elsewhere









[antiga2008]

Automatic segmentation of 4D CTA

Automatic segmentation of 4D CTA^[trentin2015]

- the user puts **seven** seeds inside the vessel
- bunch of initializations are performed looping from the first seed to the last and vice versa
- entire aorta initialized in one shot
- possibility to **detail** the segmentation **later**

Following function is defined and computed

$$F_k(\mathbf{x}) = \sum_{i=k}^{k+1} \sum_{j=k}^{k+1} \nabla T_i \cdot \nabla T_j, \qquad i \neq j$$

- k = 1, ..., 6, i, and j represent the user defined seeds
- T_i and T_j satisfy the equation previously defined in I

We take

$$\Phi_0(\mathbf{x}) = \min_{\mathbf{x} \in \mathbb{R}^3} \{F_1(\mathbf{x}), \dots, F_6(\mathbf{x})\}$$

negative inside the vessel and positive outside



Automatic segmentation of 4D CTA^[trentin2015]: shift

Hypothesis:

 two subsequent time instants do not experience high changes of position

Remark:

 the aortic arch level set produced is a signed distance function

Method:

- result of the evolution at 1st time instant is shifted 1 mm inside the vessel
- the shifted initialization is used as initial level set for the subsequent time instant





Result of the shift of 1 mm inside the vessel, displayed on the 4D CTA at the 1^{st} time instant

Automatic segmentation of 4D CTA

Automatic segmentation of 4D CTA: new pipeline^[trentin2015]

- equation is then evolved with parameters:
- **automatically** repeated for each time step
- user's workload reduced



 $w_1 = 0.4$, $w_2 = 0.4$, and $w_3 = 1.0$

Centerline definition and branch splitting procedure

Centerline

- synthetic descriptor of vessel geometry drawn between an inflow section and multiple outflow sections
- locally maximizes the distance from the vessel's wall^[antiga2008]

Bifurcation reference system (BRS) definition:

- four points delimit a segment on each centerline
- the segment identify the bifurcation region
- the four points identify the **origin of the bifurcation** region

Branch extraction procedure:

• BRS allows decomposition of centerlines

in different tracts belonging to different branches

- each centerline $c_i(s)$ grouped into tracts defined by s in $[0,s_i^B]$ and $[s_i^A, L_i]$
- it is possible to **decompose R³ into groups** exploiting a distance metrics
- the ith group is composed by the union of points closer to group function $\gamma_i(s)$ than to any other group function $\gamma_i(s)$

C2A

Xo

Bifurcation reference system transformation

- **compare** pre- and post-TEVAR 3D reconstructed models
- assess good outcomes
- understand the changes induced by the metallic stent-graft on vessel's shape
- track changes experienced by the thoracic aorta during the cardiac cycle

A rigid-body transformation between the models under investigation is needed

$$\mathbf{x}_{\mathbf{A}}^{\mathbf{transf}} = R_{AB}(\mathbf{x}_{\mathbf{A}}) + \mathbf{T}_{\mathbf{AB}}$$

where $R_{AB}\,is$ a rotation matrix and a $T_{AB}\,is$ a translation vector

We choose to:

- transforms not a set of point defined by the user but a reference system integral with the surfaces under investigation
- simple but robust

Bifurcation reference system transformation

Bifurcation reference system BRS is:

• **stable** than other points along the centerline

An alignment of the pre-TEVAR BSR into the post-TEVAR BSR is performed.

Translation vector T_{PrePost}:

distance between the origin of the BSRs:

$$\mathbf{T_{PrePost}} = X[i]_{pre} - X[i]_{post}$$

Rotation matrix R_{PrePost}:

- build up from the rotation angles
- Euler angles three angles to describe the orientation of a rigid body in 3dimensional Euclidean space



Bifurcation reference system transformation

The three angles are defined as follows:

- α is the angle between the Normalpre axis and the N axis
- β is the angle between the UpNormalpre axis and the UpNormalpost axis
- γ is the angle between the N axis and the Normalpost axis



$$\mathbf{x}_{\mathbf{Pre}}^{\mathbf{transf}} = R_{PrePost}(\mathbf{x}_{\mathbf{Pre}}) + \mathbf{T}_{\mathbf{PrePost}}$$

Angular parametrization of vessel's surface is exploited to perform a surface data analysis \rightarrow outer contour lines

Given a cylindrical surface $\partial \Gamma_i$ of a branch i with extremities given by two topological circle ψ_{i0} and ψ_{i1} , we search for a bijective mapping

$$\Phi:\partial\Gamma_{i_{\mathbf{x}}}\to\mathcal{U}_{\mathbf{u}}$$

 ψ_{i1} ψ_{i0}

 $\mathcal{U} \subset \mathbb{R}^2 \rightarrow$ parametric space in the coordinates **u** = (u, v)

- $u \in [0, L_i] \rightarrow$ the longitudinal parametric coordinate
- $v \in [-\pi, \pi] \rightarrow$ the periodic circumferential parametric coordinate
- $\Phi(\mathbf{x}) = (0, v)$ on ψ_{i0} and $\Phi(\mathbf{x}) = (L_i, v)$ on ψ_{i1}

Outer contour lines computation

Longitudinal mapping \rightarrow computing a harmonic function with extremes on the branch boundaries

Computation of the harmonic function f = f(x), $x \in \partial \Gamma_i \rightarrow performed by solving the partial differential equation:$

$$\Delta_B f = 0$$

with f(x) = 0 on ψ_{i0} , f(x) = 1 on ψ_{i1} and Δ_B is the Laplace-Beltrami operator.

Circumferential mapping \rightarrow angular position of surface points around the centerline, i.e., $[-\pi, \pi]$, determined by a set of normals n(s) along the curve

The parallel transport approach is exploit:

- frame (t(s+ds), n(s+ds), b(s+ds)) → derived from frame (t(s), n(s), b(s)) rotating t(s) into t(s+ds) around the vector n_s = t_s × t_{s+ds} in the osculating circle plane and than translated to (s+ds)
- frame rotated of a minimal quantities \rightarrow no twist introduced

Given^[Antiga2004]:

- s the curvilinear abscissa
- *n* the centerline normals, We compute $v(\mathbf{x})$ for each point $\mathbf{x} \in \Gamma_i$ (surface under investigation) finding:
- its nearest point c(s) on the centerline
- the projection x* of x on the plane normal to t(s) and computing

$$v(\mathbf{x}) = \arccos((\mathbf{x}^* - c(s)) \cdot n(s))$$

Decide to extract 10 iso-line with values in the interval I = $[-\pi, -4/5\pi, -3/5\pi, -2/5\pi, -1/5\pi, 0, 1/5\pi, 2/5\pi, 3/5\pi, 4/5\pi, \pi]$ for each outer contour line we define the outer length OL as:

$$OL(\theta) = \int_{P_0(\theta)}^{P_1(\theta)} s \, ds \qquad \theta \in I$$

where s \rightarrow the curvilinear abscissa

- $P_0 \rightarrow$ initial point, the longitudinal parametric map has value zero
- $P_1 \rightarrow$ the final point, the longitudinal parametric map has value one

Outer contour lines computation

Moreover we introduce a relative quantity to track the **changes in space** experienced by the aorta, named Outer Length Changes (OLC), expressed in percentage and defined as follows:

$$OLC = \frac{Amplitude(OL(\theta))}{A_{v_{space}}(OL(\theta))}$$

where

$$Amplitude(OL(\theta)) = (\max_{\theta \in I}(OL(\theta)) - \min_{\theta \in I}(OL(\theta)))$$

$$A_{v_{space}}(OL(\theta)) = \frac{1}{10} \sum_{\theta \in I} OL(\theta)$$

Clinical interpretation: high values of OLC may suggest high bending movements of the aorta

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Levels of interest: tool defines automatically six levels of interest^[trentin2015]

section A: level of the sino-tubular junction (STJ)

- **30 sections** cut the proximal aorta from the valvular plane upward (1mm spaced)
- local minima of the difference in area between the sections return the STJ



Levels of interest: tool defines automatically six levels of interest

section B: 1 cm proximal to brachiocephalic trunk

• point where the centerlines referring to the ascending aorta and the innominate artery divide



Levels of interest detection

Levels of interest: tool defines automatically six levels of interest

section C: left subclavian artery (LSA)

• point just after the LSA

section D: 10 cm distal to LSA

section E: 20 cm distal to LSA



Levels of interest: tool defines automatically six levels of interest

section F: level of celiac bifurcation

point where the centerlines referring to the descending aorta and the celiac artery divide



Measurements \rightarrow for each level of interest

AREA \rightarrow triangulation of the section of interest and sum the area of each triangle over the entire section

DIAMETER MINIMUM

$$d_{min}(S) = \min_{\mathbf{x} \in \partial S} (\max_{\mathbf{y} \in \partial S} (dist(\mathbf{x}, \mathbf{y})))$$

DIAMETER MAXIMUM

$$d_{max}(S) = \max_{\mathbf{x} \in \partial S} (\max_{\mathbf{y} \in \partial S} (dist(\mathbf{x}, \mathbf{y})))$$

where **x** and **y** are coordinates of the points of the contour ∂S of the section S, and dist(\cdot) is the Euclidean distance



Measurements

Measures \rightarrow for each level of interest

LENGTH \rightarrow L1, L2 and L3 of aortic arch between A and B, B and C, C and F

TOTAL LENGTH \rightarrow L of the thoracic aortic arch from section A to section F

$$l(S_1, S_2) = \int_{S_1}^{S_2} s \, ds$$

where s is the curvilinear abscissa defined on the centerline and s_1 and s_2 are the points of the centerline on the generic sections S_1 and S_2



Measurements

Measurements in time \rightarrow relative measurements



where

$$Amplitude(\mathbf{X}) = \left(\max_{i \in time} (\mathbf{X}[i]) - \min_{i \in time} (\mathbf{X}[i])\right)$$
$$A_{v_{time}}(\mathbf{X}) = \frac{1}{8} \sum_{i=1}^{8} \mathbf{X}[i]$$

with X vector containing quantities' values for each time instant

Clinical interpretation: measurements changes suggest high deformation in time

Results: the dataset \rightarrow 8 patients with TAA

6 male and 2 female, mean age 71

Patient	\mathbf{Sex}	Age	Diagnosis	stent-graft type	Size graft 1	Size graft 2	Size Graft 3
1	m	79	TAA	Relay, Bolton	42-42-100	38-38-100	
2	m	65	TAA	Relay, Bolton	38-38-100		
3	m	61	TAA	Valiant, Medtronic	38 - 38 - 125	40-40-150	44-44-150
4	m	80	TAA	Valiant, Medtronic	36-36-100	38-38-100	
5	m	70	TAA	Valiant, Medtronic	36-36-100		
6	m	75	TAA	Valiant, Medtronic	42-42-150		
7	f	77	TAA	Valiant, Medtronic	38-38-200	38-38-200	
8	f	59	PAU/TAA	Relay, Bolton	34-34-100		





G. B., F. N., **Chiara Trentin**, M. C., F. A., F. M., J. H., *"Impact of Thoracic Endovascular Repair on Aortic Strain in Patients with Aneurysm"*, under submission.

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Length changes

- Patient 1
 - 4.9% → 6.4% in L2
 - 3.9% → 3.9% in L3
- Patient 2
 - 5.6% → 7.8% in L1
 - 6.8% → 9% in L2
 - 4.8% → 3.8% in L3

- Patient 3
 - 6.6% → 8.5% in L2
 - 5.6% \rightarrow 3% in L3

L3

1

L2

Aortic Levels

- Patient 4
 - No post-TEVAR data



2.0%

0.0%

L1

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0.0%

L1

L2

L3

Aortic Levels

L

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Results: the TAA dataset

- Patient 5
 - 4.9% → 4.8% in L2
 - 2.3% → 1.4% in L3
- Patient 6
 - 4.3% → 5.9% in L1
 - 6% → 6.7% in L2

Aortic Levels

• 1.4% → 3.7% in L3

- Patient 7
 - 4.7% → 5.2% in L2
 - 1.2% → 8% in L3
- Patient 8
 - 5.6% → 15.6% in L1
 - 9.5% → 8.8% in L2
 - 2.5% → 5.4% in L3



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Outer length changes OLC

- overall outer length changes, **tracked in space** not in time over the entire hearth cycle
- OLC is **double in values** in the ascending aorta with respect to the descending aorta
- OLC in the ascending aorta shows a pressure like shape
- OLC in the descending aorta is slightly lower post-TEVAR





Results: the dataset \rightarrow 2 patients with TBAD and 1 control Patient 1

• 53-year old female with acute TBAD

Patient 2

• 55- year old male with Marfan syndrome and ruptured acute TBAD

Patient 3

• <u>Healthy control patient:</u> 49-year old female with thoracic pain, no vascular pathology on CT



Trentin, Chiara, F. E., C. M., A. F., "An automatic tool for thoracic aorta segmentation and 3D geometric analysis," in *Image and Signal Processing and Analysis (ISPA), 2015 9th International Symposium on*, pp.60-65, 7-9 Sept. 2015

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Results: the TBAD dataset

- Length changes of L, L1, L2, and L3
- comparison with the healthy control
- Length Changes in L2: from 8.2% (before TEVAR) to 13.1% (after TEVAR)
- region of increase located just before stent-graft

- Length changes of L, L1, L2, and L3
- comparison with the healthy control
- Length Changes in L1: from 9.4% (before TEVAR) to 15.8% (after TEVAR)
- Length Changes in L3: from 4.8% (before TEVAR) to 1.6% (after TEVAR)
- increase before stent-graft, contraction at the stent-graft

Outer length changes OLC

- overall outer length changes, tracked in space not in time over the entire hearth cycle
- OLC is **double in values** in the ascending aorta with respect to the descending aorta
- OLC in the ascending shows a pressure like pattern in the pathologic patients and a more casual pattern for the healthy control
- OLC in the descending aorta is slightly lower post-TEVAR
- OLC in the descending aorta for the healthy control is higher in value overall

Conclusions

- automatic tool to segment thoracic aorta from 4D CTA images
- automatic detection of levels of interest
- automatic geometric feature computation
- **track** the dynamic changes of the thoracic aorta
- expand the knowledge of stent-graft behaviour
- actually used by the University Medical Centre Utrecht

Future work

- image quality and artefacts avoidance
- image **registration**
- **fully integration** of the steps composing the tool (set of libraries)
- measurements of torsion and tortuosity need to be included as well as a method for centerline resampling (spline)
- integration of a **statistical analysis**

Thank you!

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