

Manuscript Number: CBM-D-19-00348R2

Title: On the Role of Material Properties in Ascending Thoracic Aortic Aneurysms

Article Type: Full Length Article

Keywords: ascending aortic aneurysm; inverse approach, material parameters, aortic aneurysm failure, finite-element analysis

Corresponding Author: Dr. Salvatore Pasta, PhD

Corresponding Author's Institution: Fondazione RiMED

First Author: Federica Cosentino

Order of Authors: Federica Cosentino; valentina agnese; Giuseppe M Raffa; giovanni gentile; diego bellavia; massimiliano zingales; michele pilato; Salvatore Pasta, PhD

Abstract: One of the obstacles standing before the biomechanical analysis of an ascending thoracic aortic aneurysm (ATAA) is the difficulty in obtaining patient-specific material properties. This study aimed to evaluate differences on ATAA-related stress predictions resulting from the elastostatic analysis based on the optimization of arbitrary material properties versus the application of patient-specific material properties determined from ex-vivo biaxial testing. Specifically, the elastostatic analysis relies on the fact that, if the aortic wall stress does not depend on material properties, the aorta has to be statistically determinate. Finite element analysis (FEA) was applied to a group of nine patients who underwent both angio-CT imaging to reconstruct ATAA anatomies and surgical repair of diseased aorta to collect tissue samples for experimental material testing. Tissue samples cut from excised ATAA rings were tested under equibiaxial loading conditions to obtain experimentally-derived material parameters by fitting stress-strain profiles. FEAs were carried out using both optimized and experimentally-derived material parameters to predict and compare the stress distribution using the mean absolute percentage error (MAPE). Although physiological strains were below yield point (range of 0.08-0.25), elastostatic analysis led to errors on the stress predictions that depended on the type of constitutive model (highest MAPE of 0.7545 for Yeoh model and 0.7683 for Fung model) and ATAA geometry (lowest MAPE of 0.0349 for patient P.7). Elastostatic analysis needs better understanding of its application for determining aneurysm mechanics, and patient-specific material parameters are essential for reliable accurate stress predictions in ATAAs

Please wait...

If this message is not eventually replaced by the proper contents of the document, your PDF viewer may not be able to display this type of document.

You can upgrade to the latest version of Adobe Reader for Windows®, Mac, or Linux® by visiting <http://www.adobe.com/products/acrobat/readstep2.html>.

For more assistance with Adobe Reader visit <http://www.adobe.com/support/products/acrreader.html>.

Windows is either a registered trademark or a trademark of Microsoft Corporation in the United States and/or other countries. Mac is a trademark of Apple Inc., registered in the United States and other countries. Linux is the registered trademark of Linus Torvalds in the U.S. and other countries.

Reviewer #4

We thank the reviewer for his or her valuable comments. We have taken these comments into careful consideration when preparing the revised manuscript and feel that the critiques led directly to an improved submission. We hope that the reviewer agrees. All changes made to the document were highlighted in yellow.

Specific comments:

Comment 1. Methods described in references (Joldes et al., 2016; Joldes et al., 2017; Lu et al., 2007b; Miller and Lu, 2013) do not assume anywhere statical determinacy. It is the conclusion from the results that if stress demonstrably does not depend on the properties, the structure must be statically determinate. I suggest re-reading these papers.

Reply: We thank the reviewer for the clarification on the meaning of “static determinacy”. We therefore rewritten the text to avoid confusion. Please see text in the Abstract that is now:

“Specifically, the elastostatic analysis relies on the fact that, if the aortic wall stress does not depend on material properties, the aorta has to be statically determinate.”

Please see text in the Introduction that is now

“However, if the stress distribution does not depend on material properties, the structure has to be statically determinate [22,28]. Under this condition, we can eliminate the need for patient-specific material properties and the FEA can be performed with arbitrary material properties because they do not affect the resulting wall stress. Several research groups adopted this approach to compute wall stress of abdominal [22] and ascending aortic aneurysms [23-26].”

Please see also similar corrections in the Discussion and Conclusion

Comment 2. When using linear finite element method, the material does not need to be chosen as very stiff, as the method assumes infinitesimal deformations anyway

Reply: We strictly followed the methodology described by Liu et al 2017 to obtain the “almost-true” stress distribution for the numerical optimization. We adopted very stiff material only to find the “almost-true” stress as described in the paper by Liu and collaborators. Nothing was added in the text if it permitted by the reviewer.

Comment 3. AAA is a 3D structure in complex 3D stress state. AAA cannot be reasonably modelled as a thin-walled structure with assumed no transverse stresses. If you computed just one case with proper 3D elements you would see non-negligible variation of stress over the wall thickness. Membrane elements are inappropriate. Justifying the use of membrane elements by stating that other groups committed the same error is unscientific.

Reply: We agree with reviewer comment that AAA is a 3D structure but this paper did not study AAA. This paper was focused on ascending thoracic aortic aneurysms (ATAA). There are many studies suggesting the pathophysiology and mechanics of AAA is different from that of ATAA. Please consider that ATAA do not present thrombus so that thickness is 2 mm and mechanics is mainly governed by in plane-stress. We agree that transverse stress exist but this component is lower than other in plane stress components. Future studies will be performed using brick elements. We agree that AAA can be statically-determinate structure so that we specified that the findings here reported are restricted to the ascending aorta with the following text in the Discussion and Conclusion sections:

“Although the stress analysis of abdominal aortic aneurysms did not depend on material properties [22], the modeling of the ascending aorta as a statically-determinate structure needs further understanding so that the role of material properties is still important for realistic and accurate stress predictions”

“We conclude that the modeling of the ascending aorta as a statically determinate can lead to errors on wall stress predictions in patient-specific FEAs since aortic wall stress was found to depend on the type of constitutive model and ATAA geometry.”

Comment 4. Use of explicit dynamics algorithm with unquantified effects of mass scaling is inappropriate.

Reply: Please consider that mass scaling was applied only at the beginning of the time step. Specifically, mass scaling was performed by scaling the masses of the elements whose element stable time increments was less than the user-supplied time increment of $1.e-7$ so that the element stable time increment for these elements becomes equal to the user-supplied time increment. So mass scaling was effective only to few elements (and not to the whole aorta). We investigated the effect on mass scaling that led to a minor change in the results. The following text was added in the methodology to clarify this aspect.

“Mass scaling was performed by scaling the masses of elements whose stable time increments was less than the user-supplied time increment of $1.e-7$ s so that the element stable time increment for these elements becomes equal to the user-supplied time increment. This approach has a minor effect on the stress analysis.”

Comment 5. It is a well-known fact that residual stresses in arterial tissues are important. Not including residual stress in the analysis is not a "study limitation" but rather invalidates the results completely. How

to include residual stress is explained e.g. in (Joldes et al., 2018; Polzer et al., 2013). A simple method of incorporating residual stress is available in open source code <http://bioparr.mech.uwa.edu.au/>

Reply: We agree with the reviewer on the importance of residual stress and will take care of this in future studies. Unfortunately, we did not study AAA and the source code here proposed appears to be focused only to abdominal aneurysms

Comment 6. Table 1 presents the measurement results of diameter and wall thickness. In the absence of information of measurement errors the reliability of this data is difficult to judge.

Reply: Please consider the aortic diameter was measured by experienced radiologists while tissue measurement by a caliper. Radiologists follow a standard protocol for aortic diameter measurements while we agree that the utilization of a caliper is not the best practice for tissue measurements but we have an experience of >100 ATAA sample measurements. The following text was added in the "Study Limitation":

"Caliper-based measurements of tissue thickness can lead to errors which in turn affect aortic wall stress predictions."

Comment 7. Figure given in response to Rev 5 (on p. 8) demonstrates the computational methods used are erroneous. The stress distributions given in the figure violate simple statics (for a given shape of the membrane and given pressure load, one cannot have different tensions...). Also, it is not possible to use Fung or Yeoh models with linear elastic analysis.

I suggest to consider carefully the following references:

(Biehler et al., 2015; Joldes et al., 2016; Joldes et al., 2017; Joldes et al., 2018; Lu et al., 2007a, b; Miller and Lu, 2013; Zelaya et al., 2014)

Reply: Linear elastic analysis using Fung and Yeoh model can be performed in Abaqus and other FEA by considering the effect of geometric nonlinearity as that given by hyperelastic material.

Minor comment:

This reference, given in support of unproven assertion that "...peak wall stress has been demonstrated to be higher in ruptured compared with non ruptured abdominal aortic aneurysms" is not appropriate.

"A.K. Venkatasubramaniam, M.J. Fagan, T. Mehta, K.J. Mylankal, B. Ray, G. Kuhan, I.C. Chetter, P.T.

McCollum, A comparative study of aortic wall stress using finite element analysis for ruptured and nonruptured abdominal aortic aneurysms, European Journal of Vascular and Endovascular Surgery, 28

(2004) 168-176."

This study did not use patient-specific material properties, patient-specific wall thickness and did not include residual stress. It also use unverified method using shell elements. Therefore, the conclusions about maximum stress values from this paper cannot be used as a justification that higher stress correlates with rupture risk.

Reply: To avoid confusion, the sentence was rewritten as a follow:

"These approaches for risk stratification appeared to be promising since peak wall stress can be calculated from routinely performed CT scans and may be a better predictor of risk of rupture than aortic diameter [13]."

Please consider that this paper not focused on the justification that higher stress correlates with the rupture risk but rather on the role of material properties in FEA of ATAAs.

1
2
3
4
5
6
7
8
9
10
11
12
13
14
15
16
17
18
19
20
21
22
23
24
25
26
27
28
29
30
31
32
33

On the Role of Material Properties in Ascending Thoracic Aortic Aneurysms

Federica Cosentino^{1,2}, Valentina Agnese³, Giuseppe M Raffa³, Giovanni Gentile³, Diego Bellavia³, Massimiliano Zingales⁴, Michele Pilato³, Salvatore Pasta^{2,3*}

¹ Biomedical Department of Internal Medicine and Specialities (DIBIMIS), Piazza delle Cliniche, n.2, 90128, University of Palermo, Palermo, Italy

² Fondazione Ri.MED, Via Bandiera n.11, 90133, Palermo, Italy;

³ Department for the Treatment and Study of Cardiothoracic Diseases and Cardiothoracic Transplantation, IRCCS-ISMETT, Via Tricomi n.5, 90127, Palermo, Italy

⁴ Department of Civil, Environmental, Aerospace, Materials Engineering (DICAM), Viale delle Scienze Ed.8, 90128, University of Palermo, Palermo, Italy

Conflict of interest: none

* Corresponding author:

Salvatore Pasta, PhD

Professor of Industrial Bioengineering,

Fondazione Ri.MED

Phone: +39 091 3815681

FAX: +39 091 3815682

e-mail: spasta@fondazionerimed.com

34 **Abstract:** One of the obstacles standing before the biomechanical analysis of an ascending
35 thoracic aortic aneurysm (ATAA) is the difficulty in obtaining patient-specific material properties.
36 This study aimed to evaluate differences on ATAA-related stress predictions resulting from the
37 elastostatic analysis based on the optimization of arbitrary material properties versus the
38 application of patient-specific material properties determined from *ex-vivo* biaxial testing.
39 Specifically, the elastostatic analysis relies the on the fact that, if the aortic wall stress does not
40 depend on material properties, the aorta has to be statistically determinate. Finite element
41 analysis (FEA) was applied to a group of nine patients who underwent both angio-CT imaging to
42 reconstruct ATAA anatomies and surgical repair of diseased aorta to collect tissue samples for
43 experimental material testing. Tissue samples cut from excised ATAA rings were tested under
44 equibiaxial loading conditions to obtain experimentally-derived material parameters by fitting
45 stress-strain profiles. FEAs were carried out using both optimized and experimentally-derived
46 material parameters to predict and compare the stress distribution using the mean absolute
47 percentage error (MAPE). Although physiological strains were below yield point (range of 0.08-
48 0.25), elastostatic analysis led to errors on the stress predictions that depended on the type of
49 constitutive model (highest MAPE of 0.7545 for Yeoh model and 0.7683 for Fung model) and
50 ATAA geometry (lowest MAPE of 0.0349 for patient P.7). Elastostatic analysis needs better
51 understanding of its application for determining aneurysm mechanics, and patient-specific
52 material parameters are essential for reliable accurate stress predictions in ATAAs.

53

54 **Keywords:** ascending aortic aneurysm; inverse approach, material parameters, aortic
55 aneurysm failure, finite-element analysis

56

57 INTRODUCTION

58 A ruptured ascending thoracic aortic aneurysm (ATAA) is considered a surgical emergency
59 since progressive dilatation is often fatal if this disease is not detected by diagnostic imaging
60 and managed immediately [1]. Despite being a relatively rare event with an estimated incidence
61 of 5.0 per 100,000 individuals per year, the risk of fatal complications such as rupture or acute
62 dissections can be as high as 50% in patients with a large ATAA wall (aortic diameter >50mm)
63 [2, 3]. The risk over time of ATAA development to a size of 40-45mm in patients with a
64 congenital bicuspid aortic valve (BAV) versus the morphological normal tricuspid aortic valve
65 (TAV) is remarkable. Several studies highlighted that 84% of individuals with BAV may develop
66 aortopathy during the life course [4, 5]. With regards to ATAA, degenerative aneurysms tend to
67 develop in the mid-ascending aorta and then progress distally and proximally while ATAAs
68 associated with connective tissue disorders are usually confined to the aortic root [6].

69
70 Although the aortic size criterion can be adjusted to achieve higher patient specificity using the
71 body surface area or patient height [7], the surgical dilemma still exists because fatal
72 complications can occur at aortic diameters lower than that dictated by current clinical
73 guidelines for elective repair of aneurysmal aorta [8]. There is a need to delineate additional
74 metrics, not based on aortic size, to better identify the risk of ATAA failure. Biomechanical risk
75 assessments using finite element analysis (FEA) to estimate the wall stress exerted on the
76 diseased aorta have been proposed in abdominal aortic aneurysms [9] [10] and ATAAs [11, 12].
77 **These approaches for risk stratification appeared to be promising since peak wall stress can be**
78 **calculated from routinely performed CT scans and may be a better predictor of risk of rupture**
79 **than aortic diameter** [13]. Recently, FEA was combined with machine learning techniques to
80 study the relationship between shape features and wall stress as risk metric of ATAA, towards
81 the development of computer-aided-diagnosis [14].

82

83 FEAs depend on several factors including the aortic geometry, the loading condition induced by
84 hemodynamic and structural loads and the material properties of aortic wall constituents.
85 Hemodynamic can be evaluated by computational fluid dynamic [15-18] or *in-vivo* 4D flow MRI
86 [19] while tracking algorithms of aortic wall surface detected by dynamic CT [20] or MRI [21] can
87 be adopted to estimate the ATAA-related structural mechanics. Obtaining material parameters
88 non-invasively during patient monitoring for preoperative risk estimations represent an important
89 challenge. However, if the stress distribution does not depend on material properties, the
90 structure has to be statically determinate [22,28]. Under this condition, we can eliminate the
91 need for patient-specific material properties and the FEA can be performed with arbitrary
92 material properties because they do not affect the resulting wall stress. Several research groups
93 adopted this approach to compute wall stress of abdominal [22] and ascending aortic
94 aneurysms [23-26].

95
96 In this proof-of-concept, assuming static determinacy for the aorta, we want to know how
97 different would be the resulting stress distribution on the aneurysm wall if material properties
98 derived by an elastostatic analysis proposed by Liu et al. [23] are used as compared to FEAs
99 using patient-specific material properties determined from *ex-vivo* biaxial testing. If large
100 differences of stress distributions are observed, one could raise a red flag for further
101 investigation using this appealing approach. To accomplish this task, we carried out FEAs on
102 nine patients who underwent both dynamic CT imaging and surgical elective repair of ATAA to
103 both reconstruct aortic geometries for FEA and collect tissue samples for patient-specific
104 material property evaluation by the fitting of experimental stress-strain curves. Both an isotropic-
105 (ie, two-term Yeoh model) and an anisotropic (ie, Fung-exponential model) constitutive
106 formulation were tested. A stress comparison using the optimal material set versus the
107 experimentally-derived material set was performed, and results were discussed.

108

109 **METHODS**

110 ***Study Population***

111 All nine patients included in this investigation had electrocardiogram-gated computed
112 tomography angiography (ECG-gated CT) for the measurement of the maximum aortic diameter
113 and then elective surgical repair of dilated aortas at ISMETT IRCCS hospital institution. ECG-
114 gated CT scans were reconstructed to obtain images at both diastolic and systolic cardiac
115 phases, which were used for the estimation of the diastolic-to-systolic displacement field of the
116 aortic wall. This displacement field was used as a boundary condition for FEA as previously
117 described by our group [27]. Aortic valve shape was classified as TAV versus BAV based on
118 reconstructed images parallel to the aortic valve plane. The presence of the raphe was used to
119 group BAV morphology according to the fusion of right and left cusps (AP) as well as the fusion
120 of right and non-coronary cusp (RL). After surgical ATAA repair, excised aortic tissues were
121 stored in a physiologic solution upon biaxial mechanical testing. Table 1 shows patient
122 demographic information, pre-operative aortic diameters and thickness measurements. The
123 study was approved by the local research ethics committee, and all patients signed informed
124 consent prior enrollment.

125

126 ***Biaxial Testing***

127 Experimentally-related material properties from aneurysmal tissue samples collected for each
128 patient were estimated by equibiaxial mechanical testing using an ElectroForce TestBench
129 system (TA Instrument, Boston, MA). In brief, square specimens (10x10mm) cut from the tissue
130 region located along the major curvature of the aortic ring were extrapolated. Each specimen
131 was oriented along longitudinal and circumferential directions of the aortic vessel while sutures
132 were used to fix specimen edge using surgical staples. Thickness was measured with a caliper
133 for each sample (see Table 1). Five black markers were placed on the intimal aortic tissue
134 surface to evaluate engineering strains along testing directions using a digital video

135 extensometer placed perpendicular to the testing area. During biaxial loading, the specimen
 136 was sub-merged in 0.9% physiologic saline solution in a bath under controlled temperature of
 137 37°C. A small preload (0.5 grams) was set prior to the displacement-driven testing protocol and,
 138 after preconditioning, a constant speed of 1mm/min was applied to four electromagnetic motors
 139 for loading the specimen under equibiaxial condition. Two 200N load cells were used to record
 140 forces along material directions. Data analysis to obtain stress and strain were calculated as
 141 defined in the constitutive modeling section.

142

143 ***Constitutive Modeling***

144 FEAs were carried out using two specific classes of materials: a) the isotropic Yeoh material
 145 model in the two-term formulation proposed by Raghavan and Vorp [9] for abdominal aortic
 146 aneurysms, and b) the orthotropic Fung-exponential model that is often used in soft tissue
 147 biomechanics. Both models adopt homogenous, incompressible and hyperplastic description of
 148 ATAA wall mechanics.

149

150 In short, the two-term Yeoh constitutive model relates the stress tensors (S) in the loaded
 151 specimen to the stretch (λ) through the equation:

$$152 \quad S_{11} = S_{22} = \left[2 c_1^{(Y)} + 4 c_2^{(Y)} (\lambda^2 + 2 \lambda^{-1} - 3) \right] [\lambda^2 - \lambda^{-1}] \quad (1)$$

153 with $c_1^{(Y)}$ and $c_2^{(Y)}$ are material model parameters indicative of the mechanical properties of the
 154 ATAA wall, and λ is equal to the deformed specimen length divided by the original length.

155 $S_{33} = 0$ according to the membrane stress state assumption adopted in our FEA approach.

156

157 The free energy function for the Fung model was:

$$158 \quad f(\mathbf{C}) = \frac{c_1^{(F)}}{2} \left[\exp[Q(\mathbf{C})] - 1 \right] \quad (2)$$

159 with $[c_1^{(F)}] = F/L$ the material-like parameter , $\mathbf{C} = \mathbf{F}^T \mathbf{F}$ the right Cauchy-Green strain tensor

160 while the material-dependent exponent, $Q(\mathbf{C})$, was a quadratic form of Cauchy-Green strain

161 tensor $\mathbf{C} = \mathbf{F}^T \mathbf{F}$:

$$162 \quad Q(\mathbf{C}) = a_1 I_1^2 + a_2 I_2^2 + 2a_3 I_1 I_2 \quad (3)$$

163 with a_1, a_2, a_3 the dimensionless parameter.

164

165 The Cauchy stresses of Fung constitutive formulation are therefore expressed as:

$$\begin{aligned} \sigma_{11} &= 2\lambda_1^2 c_1^{(F)} e^Q (a_1 \lambda_1 + a_3 \lambda_2) \\ \sigma_{22} &= 2\lambda_2^2 c_1^{(F)} e^Q (a_3 \lambda_1 + a_2 \lambda_2) \end{aligned} \quad (4 \text{ a,b})$$

166 **Constitutive Material Parameter Estimation**

167 The elastostatic analysis for the evaluation of material constitutive parameters proposed by Liu
168 et al [23] is based on the main premise for which the stress distribution is statically determinate.

169 Thus, for a given ATAA deformed configuration (ie, peak of systole) and known loading

170 condition (ie, the diastolic-to-systolic displacement field), different material parameters and

171 constitutive models will give nearly the same stress field. In this way, an “almost-true” stress

172 field at systole can be approximately obtained by an infinitesimal linear elastic model with

173 sufficiently stiff material parameters. This fact has been theoretically justified by Miller and Lu

174 [28] and numerically verified by Lu et al. [29] and Joldes et al. [22]. Given the constitutive model

175 with an initial guess of material parameters (ie, $c_1^{(y)}$ and $c_2^{(y)}$ for Yeoh model and $c_1^{(F)}$, a_1 , a_2 , a_3

176 for the Fung model), by using the constitutive equations and deformation relationship between

177 the two loading states, an optimization algorithm allows to find the “true” material parameters

178 such that the difference between the estimated and “almost-true” stress fields is minimized.

179 Thus, the objective of the optimization process was to find a set of material descriptors that

180 minimize the difference between the “almost-true” systolic stress, $\tilde{\sigma}^t$, and estimated systolic
 181 stress, $\tilde{\sigma}^{est}$, for each element as:

$$\begin{aligned} \mathbf{g}_e^{(Y)} &= \sum_{m=1}^N \sum_{i=1}^2 \left[\tilde{S}_i^{(t)} - \tilde{S}_i^{(e)}(c_1^{(Y)}, c_2^{(Y)}) \right]^2 \\ \mathbf{g}_e^{(F)} &= \sum_{m=1}^N \sum_{i=1}^2 \left[\tilde{S}_i^{(t)} - \tilde{S}_i^{(F)}(c_1^{(F)}, a_1, a_2, a_3) \right]^2 \end{aligned} \quad (5 \text{ a,b})$$

182 where N is the number of elements used in each model and i is the component index of each
 183 principal stress component. Eq. 1 and Eq. 4 were used for the estimated systolic stress of Yeoh
 184 and Fung models, respectively.

185

186 The optimization was implemented in the mathematical language program, MATLAB (v2018,
 187 Mathworks, MA, USA). Nonlinear least-squares algorithm with trust-region-reflective was used
 188 for the optimization of Yeoh material parameters using $c_1^{(Y)} > 0$ and $c_2^{(Y)} > 0$ as lower bounds. For
 189 the Fung-exponential form, physically meaningful and plausible material parameters were
 190 obtained by enforcing the convexity of the strain energy function and thus performing
 191 constrained minimization. For planar biaxial loading of soft tissue, strict convexity physically
 192 implies that the projections of the contour of $f(\mathbf{C})$ on the $I_1 - I_2$ plane form a convex surface
 193 [30]. It can be shown that if $c_1^{(F)} > 0$, then Eq. 4 is likely convex if and only if $a_1 > 0$, $a_2 > 0$ and
 194 $a_1 a_2 - a_3^2 > 0$

195

196 For the estimation of the “almost-true” systolic stress distribution, we selected a very stiff
 197 material for the aortic wall ($E=2 \times 10^4$ GPa and $\nu=0.49$) to obtain Cauchy stress. As initial guess
 198 of material descriptors, we used the population-average material properties reported by Pasta et
 199 al. [31] for the two-term Yeoh model and by Azdani et al. [32] for the Fung model of ATAAs. For

200 each optimization procedure, principal stresses were imported in MATALB by postprocessing of
201 ABAQUS models, and the optimization was done to obtain the optimal material parameters.
202

203 ***Computational Study***

204 ECG-gated CT images were used to segment the ATAA wall at both end-diastolic and peak-
205 systolic cardiac phases using the medical imaging software Mimics (Mimics v20, Materialise,
206 Leuven, BE) [15, 33]. Semi-automatic threshold-based segmentation of aortic lumen allowed us
207 to obtain a point cloud (resolution of 0.3 mm), which was triangulated to generate a surface
208 mesh of both diastolic and systolic ATAA geometries. Using an algorithm previously developed
209 by our group in MATLAB (v2018, Mathworks, MA, USA), the point cloud of the diastolic aortic-
210 luminal surface was projected normally onto the systolic aortic-luminal surface to determine the
211 displacement field as the Euclidean distance between closest points [15]. The estimated
212 diastolic-to-systolic displacement field was then implemented as a boundary condition in the
213 FEA model for estimating wall stresses.

214
215 For each patient, FEAs were developed using the reconstructed ATAA geometry at diastole,
216 which was meshed with quadrilateral (M3D4R) and triangular (M3D3) membrane elements in
217 ABAQUS/Explicit (v2018, SIMULIA Inc, Providence, RI). Reduced integration was used for the
218 4-node quadrilateral membrane element. Grid convergence led to an element size of 0.7mm
219 (element range of 28,200-37,500) to obtain a reproducible stress analysis of the human thoracic
220 aorta [34]. Uniform material properties were adopted for the aortic wall while thickness
221 measured from tissue samples was set for each patient simulation. Distal ends of the
222 descending aorta and supra-aortic vessels were fixed in all directions. Material fiber direction
223 was set using multiple cylindrical coordinate systems with origins in the centerline of the
224 aneurysmal aorta. The ATAA wall was modeled using two constitute formulations to assess the

225 role of the isotropic- and anisotropic material behavior on the resulting stress distribution. The
226 density of the aortic tissue was 1060 kg/m^3 . In the Abaqus/Explicit solver, ATAA wall mechanics
227 was modeled as a quasi-static process while the energy was monitored to ensure the ratio of
228 kinetic energy to internal energy remains less than 10%. Adequate time step was applied while
229 an element-by-element stable time increment estimate, coupled with a “variable mass scaling
230 technique,” reduced the computational cost of each simulation. Mass scaling was performed by
231 scaling the masses of elements whose stable time increments was less than the user-supplied
232 time increment of $1.e-7 \text{ s}$ so that the element stable time increment for these elements becomes
233 equal to the user-supplied time increment. This approach has a minor effect on the stress
234 analysis.

235

236 The numerical strategy is here summarized:

- 237 1. For the estimation of the “almost-true” stress distribution, the FEA model of each patient
238 was loaded with a uniform peak systolic pressure distribution of 120mmHg in a very stiff
239 aortic wall ($E=2 \times 10^4 \text{ GPa}$ and $\nu=0.49$). This approach led to infinitesimal deformation of
240 aneurysmal aorta.
- 241 2. The resulting “almost-true” stress distribution was adopted to optimize the population-
242 average material descriptors of Yeoh and Fung constitutive relationships. This step
243 allowed us to find the optimal material parameters specific to a given patient geometry.
- 244 3. A second set of simulations was performed using the optimal material properties and
245 the diastolic-to-systolic displacement field (instead of the uniform pressure distribution)
246 to find realistic deformation of ATAA wall.
- 247 4. A third set of simulations was carried out using the displacement field as the boundary
248 condition but using the experimental material properties evaluated from *ex-vivo* material
249 testing. Then, results were compared to those observed for the second set of
250 simulations.

251

252 **RESULTS**

253 Experimental biaxial testing

254 Experimental raw data from equibiaxial testing are shown as Piola-Kirchhoff stress versus
255 engineering-strain plots for ATAAs in both circumferential and longitudinal directions of
256 ascending aorta (Figure 1). Most of stress-strain data presented a linear part, related to the
257 elastic properties of the aneurysmal aortic tissue, followed by an exponential part related to the
258 collagen fiber recruitment. These parts were separated by the “yield point”, which is more likely
259 to define the *in-vivo* stress range. For a given tissue specimen, there was no remarkable
260 difference of material response between longitudinal and circumferential directions, suggesting
261 isotropic mechanical behavior for ATAA wall as previously found [31]. Stress-strain data were
262 successfully fit by both the isotropic and anisotropic constitutive models, and the material
263 parameters for each patient were estimated (Table 2). Fitting was able to accurately reproduce
264 the non-linear behavior of experimental data ($R^2 > 0.91$ in all cases) so that material descriptors
265 can be considered as determinants of the biomechanical behavior of ATAA wall. After running
266 the elastostatic optimization analysis, material parameters were found close to those obtained
267 from the fitting of the experimental stress-strain curves. We observed that even a variation of
268 10% on the initial guess of the constitutive parameter set did not determine remarkable changes
269 on the optimal material parameters.

270

271 Strain analysis

272 Figure 2 shows the distribution of diastolic-to-systolic strain field as well as the experimental
273 stress-strain curve from biaxial testing of the aortic tissue specimen cut from the same patient. It
274 can be observed that the range of “true” strain in the circumferential direction is below the yield
275 strain, which is the value of the strain at yield point before reaching the steep increase in the
276 stress-strain response of tested aortic tissue specimen. Most of patients experienced low strain

277 at CT imaging, except for patients P.6 and P.9 who experience strains remarkably above the
278 yield strain (Table 3). This can be determined by high blood pressure induced by hypertension,
279 increased stretch and twist of aortic vessel due to heart beating and local changes of material
280 properties or tissue thickness, exposing the aneurysmal aorta at greater risk of complications
281 than other patients.

282

283 “Almost-true” stress computation

284 The distribution of “almost-true” stress determined by the simple linear-elastic FEA with the stiff
285 elastic modulus was compared to that obtained at the end of optimization procedure for each
286 patient simulation. Specifically, the maximum principal stress exerted on the ATAA wall was
287 used as an indicator of intramural stress of aneurysmal aorta. Figure 3 shows that the stiff ATAA
288 model had a stress distribution similar to that of Fung model but different from that shown by the
289 Yeoh model. The mean absolute percentage error (MAPE) was calculated for each patient as a
290 measure of differences among simulation approaches. For the patient P.1 shown in Figure 3,
291 the MAPE was nearly 30% between the “almost-true” and Yeoh models and 8.5% between the
292 “almost-true” and Fung models. For other patient cases, we found errors in the range of 6-18%.

293

294 Biaxial testing of optimal vs experimental material parameters

295 Optimized material parameters obtained from elastostatic analysis were used to determine the
296 stress-strain response under equibiaxial loading conditions in a FEA reproducing the
297 experimental testing of aortic tissue sample. Then, the stress-strain curves were plotted
298 together with the experimental testing data (see Figure 4). P.2 with small strain field exhibited a
299 practically equivalent stress-strain response with both experimental and elastostatic material
300 descriptors. At strain of 14%, P.6 had the largest discrepancy of 24% in stress predictions
301 between optimized and experimental material descriptors of two-term Yeoh constitutive model.

302

303 Patient-specific FEA of optimal vs experimental material parameters

304 Figure 5 illustrates predicted wall stress distributions computed by patient-specific material
305 descriptors determined from experimental biaxial testing of Yeoh model. Local maxima of wall
306 stress were mainly placed near the maximum curvature of the ascending aorta, just above the
307 sino-tubular junction. In a similar way, Figure 6 shows predicted wall stress maps resulting from
308 the experimentally-based material fitting using the Fung model. It can be observed that stress
309 distributions are similar among constitutive formulations (ie, Yeoh versus Fung model) when
310 patient-specific material parameters are adopted.

311
312 Although biaxial testing results of optimal versus experimental material parameters are
313 encouraging, we found considerable discrepancies for the patient-specific stress predictions
314 between the optimal material parameter set versus the experimentally-derived set (Figure 7).
315 The MAPE was calculated for each patient and evinced highly variable differences from patient
316 to patient and the type of constitutive formulation (see Table 4).

317

318 **DISCUSSION**

319 In this study, we exploited the appealing concept of obtaining reasonably and accurate stress
320 solutions of aneurysm mechanics using an **inverse approach static determinacy**, and thus
321 without invoking accurate material descriptors that are hard to know before surgical
322 management of ATAAs. **Assuming static determinacy for the aorta**, we optimized population-
323 average material parameters with respect to an “the “almost-true” stress fields obtained with an
324 infinitesimal linear-elastic model based on a sufficiently stiff Young modulus [23]. The so-
325 recovered material parameters were implemented in FEAs, and then stress distributions of nine
326 ATAA geometries were compared to those predicted when patient-specific material descriptors
327 are estimated from the fitting of *ex-vivo* testing data of aortic tissue specimens collected from
328 the same patient. We observed that the stress-strain response under equibiaxial loading

329 predicted by the elastostatic analysis was consistent to the experimental material behavior if
330 strain was low (largest difference of 24% at strain of 14%). This was in agreement with findings
331 documented by Liu et al. [23]. However, the discrepancy on predicted stress distributions was
332 considerably, depending on the adopted constitutive model and ATAA shape, when FEAs were
333 performed on patient anatomies. Although the stress analysis of abdominal aortic aneurysms
334 did not depend on material properties [22], the modeling of the ascending aorta as a statically-
335 determinate structure needs further understanding so that the role of material properties is still
336 important for realistic and accurate stress predictions.

337

338 Identification of patient-specific material parameters of ATAAs deserves important interest as
339 FEAs rely on population-average values of material properties for those patients undergoing
340 close monitoring of the aneurysm size. In risk predictions of aneurysm failure, FEAs based on
341 patient-specific material descriptors were carried out in very few studies restricted to patients
342 who underwent elective surgical repair of ATAA wall to derive the material behavior from
343 uniaxial or bulge inflation tests [11, 12]. The role of material properties in computational growth
344 and remodeling analyses may be even more remarkable as stress estimations are strongly
345 dependents on local material changes [35].

346

347 To avoid *ex-vivo* material testing, inverse approaches allows to estimate material descriptors;
348 however, inverse analysis involves a complex non-linear problem [36, 37]. Most of inverse
349 techniques proposed for soft tissue mechanics attempt to minimize a cost function defined by
350 the difference between a target parameter, which is determined from medical image analysis,
351 and a candidate parameter estimated from FEA and then iteratively adjusted to tune material
352 parameters of interest [38]. However, inverse approaches are commonly time consuming due to
353 continuous interaction with the FEA solver [39]. For the ascending aorta, Trabelsi et al. [38]
354 proposed an inverse method in which the target variable was the volume variation of the aorta

355 measured from ECG-gated CT scans. They assumed a linear relationship between the
356 constitutive material parameter and the volume of the aortic luminal surface, and then carried
357 out eight FEA analyses for each patient to build datasets for several CT measurements of ATAA
358 volume at systole and mid-cardiac phase. The error attributed to this approach was 0.6% on
359 estimated CT volume and 9.6% on the predicted stress response under equibiaxial test
360 simulations. In agreement with our findings, the statically determinate inverse approach
361 proposed by Liu et al. [23] for the Gasser-Holzapfel-Ogden constitutive model demonstrated
362 comparable biaxial stress-strain curves between elastostatic analyses and experimental tests
363 estimated in a previous investigation of the same group [11]. In their patient study group,
364 patient-specific FEAs on ATAA anatomies were not done because of lack of both CT and tissue
365 data, without quantification of stress changes computed with either experimental or elastostatic-
366 based material parameters.

367

368 Generally, the stress of a deformable body depends not only on its geometry, load and
369 boundary conditions, but also on the mechanical properties of constituents. One of the
370 obstacles standing before the biomechanics community is the difficulty in obtaining patient-
371 specific properties of tissues given the absence of a methodology to non-invasively estimate
372 stress *in-vivo*. Notwithstanding, there is an emerging interest from several groups in
373 reformulating computational mechanics in a new paradigm so that computational stress
374 predictions are weakly sensitive to the variation of mechanical properties when the deformed
375 configuration is given [28]. This paradigm can apply to non-linear elastic material, because the
376 stress in such material depends on the relative deformation among two definite configurations. If
377 one of them is known, the other can be solved from equilibrium, which is dominated by in-plane
378 stress for thin-walled structure treated as a membrane. From the analysis of ECG-gated CT
379 images, we observed that strain at deformed configuration bears to the linear-elastic part of the
380 experimental stress-strain response (see Table 3), thereby supporting in part the static

381 determinacy of the aneurysmal wall. In this way, the inverse problem can be directly formulated
382 using the constitutive law as here presented or shown by other studies [23, 40] and without the
383 need of a continuous interaction with the FEA solver. Using the Fung model, Miller et al. [28]
384 investigated the sensitivity of the stress solution with respect to material parameters and
385 constitutive model in three intracranial aneurysm geometries under static determinacy. The
386 inverse stress solution was far less sensitive to material description as, for instance, the 100
387 times increase in the stiffness parameter C of the Fung model led to a 2.9% error in the
388 maximum principal stress prediction. As compared to abdominal or cerebral aneurysms, the
389 ascending aorta is cyclically stretched and twisted every heartbeat by determining the presence
390 of longitudinal and shear stresses in a way that the static equilibrium is not only governed by the
391 internal pressure. These mechanical forces are also highly dynamic (as systole is approximately
392 0.33s), thereby determining viscoelastic effects. These factors combined to residual stress likely
393 occurring in blood vessels can pose several doubts on the modeling of the ascending aorta as
394 statically-determinate structure.

395

396 The major limitation of this study is that comparisons of stress predictions were carried out
397 assuming the experimentally-derived material parameters as the true material descriptors of the
398 ATAA wall, but these can be indeed different from the *in-vivo* condition. However, there is no
399 methodology to *in-vivo* estimate the material behavior so that experimental material parameters
400 are the most accurate ATAA material descriptors. FEAs were based on homogenous thickness
401 and material properties for the whole aorta but there exist evidence of regional changes in the
402 material properties and thickness along the vessel circumference [41] and from the aortic root to
403 the distal ascending aorta [42]. It should be mentioned that the optimization procedure can be
404 modified to account for heterogenous thickness and regionally-dependent material properties by
405 slightly altering the workflow and evaluating the objective function element-by-element.
406 Disregarding the presence of residual stresses and considering the arterial wall as a 3D

407 membrane with uniform thickness can be considered as additional limitations of the current
408 work. It was assumed that the aortic wall behaves as a membrane with no bending moments or
409 no through thickness shear, although regions near the branches may not satisfy the membrane
410 assumption. The orientation of elastic fiber was not considered in FEAs, and this may alter the
411 stress distribution as demonstrated in a previous study [31]. Caliper-based measurements of
412 tissue thickness can lead to errors which in turn affect aortic wall stress predictions.

413

414 **CONCLUSION**

415 We conclude that the modeling of the ascending aorta as a statically determinate can lead to
416 errors on wall stress predictions in patient-specific FEAs since aortic wall stress was found to
417 depend on the type of constitutive model and ATAA geometry. Static determinacy needs better
418 understanding of its application to determine ascending aortic aneurysm mechanics so that
419 patient-specific material descriptors as determined by *ex-vivo* material testing are advocated for
420 reliable accurate stress predictions of ATAA wall mechanics.

421

422 **ACKNOWLEDGMENTS**

423 This work was supported by a “Ricerca Finalizzata” grant from the Italian Ministry of Health (GR-
424 2011-02348129) as well as by a grant from Fondazione RiMED to Salvatore Pasta. Federica
425 Cosentino thanks the Fondazione RiMED and Ministry of Education, University and Research
426 (MIUR) for supporting her PhD programme.

427 **REFERENCES**

- 428 [1] L.K. Bickerstaff, P.C. Pairolero, L.H. Hollier, L.J. Melton, H.J. Van Peenen, K.J. Cherry, J.W.
429 Joyce, J.T. Lie, Thoracic aortic aneurysms: a population-based study, *Surgery*, 92 (1982)
430 1103-1108.
- 431 [2] M.A. Coady, J.A. Rizzo, G.L. Hammond, D. Mandapati, U. Darr, G.S. Kopf, J.A. Elefteriades,
432 O.W. Isom, F. Robicsek, R.B. Griepp, What is the appropriate size criterion for resection of
433 thoracic aortic aneurysms?, *Journal of Thoracic and Cardiovascular Surgery*, 113 (1997)
434 476-491.
- 435 [3] J.A. Beckman, Aortic aneurysms: pathophysiology, epidemiology and prognosis, in: M.A.
436 Creager, V.J. Dzau, J. Loscalzo (Eds.) (eds): *Vascular Medicine*, Saunders Elsevier,
437 Philadelphia, PA, 2006.
- 438 [4] S. Verma, S.C. Siu, Aortic dilatation in patients with bicuspid aortic valve, *N Engl J Med*, 370
439 (2014) 1920-1929.
- 440 [5] M.A. Borger, P.W.M. Fedak, E.H. Stephens, T.G. Gleason, E. Girdauskas, J.S. Ikonomidis,
441 A. Khoynzhad, S.C. Siu, S. Verma, M.D. Hope, D.E. Cameron, D.F. Hammer, J.S. Coselli,
442 M.R. Moon, T.M. Sundt, A.J. Barker, M. Markl, A. Della Corte, H.I. Michelena, J.A.
443 Elefteriades, The American Association for Thoracic Surgery consensus guidelines on
444 bicuspid aortic valve-related aortopathy: Full online-only version, *J Thorac Cardiovasc Surg*,
445 156 (2018) e41-e74.
- 446 [6] A. Della Corte, C. Bancone, C. Quarto, G. Dialetto, F.E. Covino, M. Scardone, G. Caianiello,
447 M. Cotrufo, Predictors of ascending aortic dilatation with bicuspid aortic valve: a wide
448 spectrum of disease expression, *Eur J Cardiothorac Surg*, 31 (2007) 397-404; discussion
449 404-395.
- 450 [7] J.A. Elefteriades, E.A. Farkas, Thoracic aortic aneurysm clinically pertinent controversies
451 and uncertainties, *J Am Coll Cardiol*, 55 (2010) 841-857.

452 [8] L.A. Pape, T.T. Tsai, E.M. Isselbacher, J.K. Oh, P.T. O'Gara, A. Evangelista, R. Fattori, G.
453 Meinhardt, S. Trimarchi, E. Bossone, T. Suzuki, J.V. Cooper, J.B. Froehlich, C.A. Nienaber,
454 K.A. Eagle, Aortic diameter ≥ 5.5 cm is not a good predictor of type A aortic dissection -
455 Observations from the international registry of acute aortic dissection (IRAD), *Circulation*, 116
456 (2007) 1120-1127.

457 [9] M.L. Raghavan, D.A. Vorp, Toward a biomechanical tool to evaluate rupture potential of
458 abdominal aortic aneurysm: identification of a finite strain constitutive model and evaluation
459 of its applicability, *Journal of Biomechanics*, 33 (2000) 475-482.

460 [10] M.F. Fillinger, S.P. Marra, M.L. Raghavan, F.E. Kennedy, Prediction of rupture risk in
461 abdominal aortic aneurysm during observation: Wall stress versus diameter, *J Vasc Surg*, 37
462 (2003) 724-732.

463 [11] C. Martin, W. Sun, T. Pham, J. Elefteriades, Predictive biomechanical analysis of ascending
464 aortic aneurysm rupture potential, *Acta Biomater*, 9 (2013) 9392-9400.

465 [12] O. Trabelsi, F.M. Davis, J.F. Rodriguez-Matas, A. Duprey, S. Avril, Patient specific stress
466 and rupture analysis of ascending thoracic aneurysms, *J Biomech*, 48 (2015) 1836-1843.

467 [13] A.K. Venkatasubramaniam, M.J. Fagan, T. Mehta, K.J. Mylankal, B. Ray, G. Kuhan, I.C.
468 Chetter, P.T. McCollum, A comparative study of aortic wall stress using finite element
469 analysis for ruptured and non-ruptured abdominal aortic aneurysms, *European Journal of*
470 *Vascular and Endovascular Surgery*, 28 (2004) 168-176.

471 [14] L. Liang, M. Liu, C. Martin, J.A. Elefteriades, W. Sun, A machine learning approach to
472 investigate the relationship between shape features and numerically predicted risk of
473 ascending aortic aneurysm, *Biomech Model Mechanobiol*, 16 (2017) 1519-1533.

474 [15] S. Pasta, G. Gentile, G.M. Raffa, D. Bellavia, G. Chiarello, R. Liotta, A. Luca, C. Scardulla,
475 M. Pilato, In Silico Shear and Intramural Stresses are Linked to Aortic Valve Morphology in
476 Dilated Ascending Aorta, *European journal of vascular and endovascular surgery : the official*
477 *journal of the European Society for Vascular Surgery*, 54 (2017) 254-263.

- 478 [16] A. Rinaudo, S. Pasta, Regional variation of wall shear stress in ascending thoracic aortic
479 aneurysms, Proceedings of the Institution of Mechanical Engineers. Part H, Journal of
480 engineering in medicine, 228 (2014) 627-638.
- 481 [17] J.J. Lee, G. D'Ancona, A. Amaducci, F. Follis, M. Pilato, S. Pasta, Role of computational
482 modeling in thoracic aortic pathology: a review, J Card Surg, 29 (2014) 653-662.
- 483 [18] G. D'Ancona, A. Amaducci, A. Rinaudo, S. Pasta, F. Follis, M. Pilato, R. Baglini,
484 Haemodynamic predictors of a penetrating atherosclerotic ulcer rupture using fluid-structure
485 interaction analysis, Interactive cardiovascular and thoracic surgery, 17 (2013) 576-578.
- 486 [19] A.J. Barker, C. Lanning, R. Shandas, Quantification of Hemodynamic Wall Shear Stress in
487 Patients with Bicuspid Aortic Valve Using Phase-Contrast MRI, Annals of Biomedical
488 Engineering, 38 (2010) 788-800.
- 489 [20] S. Pasta, V. Agnese, M. Di Giuseppe, G. Gentile, G.M. Raffa, D. Bellavia, M. Pilato, In Vivo
490 Strain Analysis of Dilated Ascending Thoracic Aorta by ECG-Gated CT Angiographic
491 Imaging, Annals of biomedical engineering, 45 (2017) 2911-2920.
- 492 [21] H. Haraldsson, M. Hope, G. Acevedo-Bolton, E. Tseng, X. Zhong, F.H. Epstein, L. Ge, D.
493 Saloner, Feasibility of asymmetric stretch assessment in the ascending aortic wall with
494 DENSE cardiovascular magnetic resonance, J Cardiovasc Magn Reson, 16 (2014) 6.
- 495 [22] G.R. Joldes, K. Miller, A. Wittek, B. Doyle, A simple, effective and clinically applicable
496 method to compute abdominal aortic aneurysm wall stress, J Mech Behav Biomed Mater, 58
497 (2016) 139-148.
- 498 [23] M. Liu, L. Liang, W. Sun, A new inverse method for estimation of in vivo mechanical
499 properties of the aortic wall, J Mech Behav Biomed Mater, 72 (2017) 148-158.
- 500 [24] S. Farzaneh, O. Trabelsi, S. Avril, Inverse identification of local stiffness across ascending
501 thoracic aortic aneurysms, Biomech Model Mechanobiol, (2018).

- 502 [25] L. Liang, M. Liu, C. Martin, W. Sun, A deep learning approach to estimate stress
503 distribution: a fast and accurate surrogate of finite-element analysis, *J R Soc Interface*, 15
504 (2018).
- 505 [26] B.J. Doyle, P.E. Norman, P.R. Hoskins, D.E. Newby, M.R. Dweck, Wall Stress and
506 Geometry of the Thoracic Aorta in Patients With Aortic Valve Disease, *Ann Thorac Surg*, 105
507 (2018) 1077-1085.
- 508 [27] V. Mendez, M. Di Giuseppe, S. Pasta, Comparison of hemodynamic and structural indices
509 of ascending thoracic aortic aneurysm as predicted by 2-way FSI, CFD rigid wall simulation
510 and patient-specific displacement-based FEA, *Computers in Biology and Medicine*, 100
511 (2018) 221-229.
- 512 [28] K. Miller, J. Lu, On the prospect of patient-specific biomechanics without patient-specific
513 properties of tissues, *J Mech Behav Biomed Mater*, 27 (2013) 154-166.
- 514 [29] J. Lu, X.L. Zhou, M.L. Raghavan, Inverse method of stress analysis for cerebral aneurysms,
515 *Biomechanics and Modeling in Mechanobiology*, 7 (2008) 477-486.
- 516 [30] G.A. Holzapfel, T.C. Gasser, R.W. Ogden, A new constitutive framework for arterial wall
517 mechanics and a comparative study of material models, *Journal of Elasticity*, 61 (2000) 1-48.
- 518 [31] S. Pasta, J.A. Phillippi, A. Tsamis, A. D'Amore, G.M. Raffa, M. Pilato, C. Scardulla, S.C.
519 Watkins, W.R. Wagner, T.G. Gleason, D.A. Vorp, Constitutive modeling of ascending
520 thoracic aortic aneurysms using microstructural parameters, *Med Eng Phys*, 38 (2016) 121-
521 130.
- 522 [32] A.N. Azadani, S. Chitsaz, A. Mannion, A. Mookhoek, A. Wisneski, J.M. Guccione, M.D.
523 Hope, L. Ge, E.E. Tseng, Biomechanical properties of human ascending thoracic aortic
524 aneurysms, *Ann Thorac Surg*, 96 (2013) 50-58.
- 525 [33] S. Pasta, A. Rinaudo, A. Luca, M. Pilato, C. Scardulla, T.G. Gleason, D.A. Vorp, Difference
526 in hemodynamic and wall stress of ascending thoracic aortic aneurysms with bicuspid and
527 tricuspid aortic valve, *J Biomech*, 46 (2013) 1729-1738.

528 [34] D.P. Nathan, C. Xu, J.H. Gorman III, R.M. Fairman, J.E. Bavaria, R.C. Gorman, K.B.
529 Chandran, B.M. Jackson, Pathogenesis of acute aortic dissection: a finite element stress
530 analysis, *Ann Thorac Surg*, 91 (2011) 458-463.

531 [35] G. Martufi, T.C. Gasser, J.J. Appoo, E.S. Di Martino, Mechano-biology in the thoracic aortic
532 aneurysm: a review and case study, *Biomech Model Mechanobiol*, 13 (2014) 917-928.

533 [36] J.E. Zelaya, S. Goenezen, P.T. Dargon, A.F. Azarbal, S. Rugonyi, Improving the efficiency
534 of abdominal aortic aneurysm wall stress computations, *Plos One*, 9 (2014) e101353.

535 [37] J. Biehler, M.W. Gee, W.A. Wall, Towards efficient uncertainty quantification in complex
536 and large-scale biomechanical problems based on a Bayesian multi-fidelity scheme,
537 *Biomech Model Mechanobiol*, 14 (2015) 489-513.

538 [38] O. Trabelsi, A. Duprey, J.P. Favre, S. Avril, Predictive Models with Patient Specific Material
539 Properties for the Biomechanical Behavior of Ascending Thoracic Aneurysms, *Ann Biomed*
540 *Eng*, 44 (2016) 84-98.

541 [39] A. Wittek, K. Karatolios, C.P. Fritzen, J. Bereiter-Hahn, B. Schieffer, R. Moosdorf, S. Vogt,
542 C. Blase, Cyclic three-dimensional wall motion of the human ascending and abdominal aorta
543 characterized by time-resolved three-dimensional ultrasound speckle tracking, *Biomech*
544 *Model Mechanobiol*, 15 (2016) 1375-1388.

545 [40] M. Peirlinck, M. De Beule, P. Segers, N. Rebelo, A modular inverse elastostatics approach
546 to resolve the pressure-induced stress state for in vivo imaging based cardiovascular
547 modeling, *J Mech Behav Biomed Mater*, 85 (2018) 124-133.

548 [41] D.C. Iliopoulos, R.P. Deveja, E.P. Kritharis, D. Perrea, G.D. Sionis, K. Toutouzas, C.
549 Stefanadis, D.P. Sokolis, Regional and directional variations in the mechanical properties of
550 ascending thoracic aortic aneurysms, *Medical Engineering & Physics*, 31 (2009) 1-9.

551 [42] A.N. Azadani, S. Chitsaz, P.B. Matthews, N. Jaussaud, J. Leung, T. Tsinman, L. Ge, E.E.
552 Tseng, Comparison of mechanical properties of human ascending aorta and aortic sinuses,
553 *Ann Thorac Surg*, 93 (2012) 87-94.

555 **Figure Legends**

556 **Figure 1:** Equibiaxial raw stress-strain data for ATAA specimens in (A) circumferential (CIRC)
557 and (B) longitudinal (LONG) directions; labels indicate specimens obtained from same patient

558 **Figure 2:** Representative distribution of circumferential strain for patient P.2 as obtained after
559 optimization procedure and raw stress-strain data in the circumferential direction showing the
560 range of strain.

561 **Figure 3:** Distribution of “almost-true” stress determined using a very stiff material for the aortic
562 wall as compared to stress from the optimal material properties for the Yeoh and Fung
563 constitutive models of P.1

564 **Figure 4:** Comparison of stress-strain response curves under equibiaxial loading condition for
565 three representative patients as modeled with two-term Yeoh constitutive model (top row) and
566 Fung-exponential model (bottom row) using experimental and optimized material parameters;
567 dots indicates maximum value of peak systolic strain

568 **Figure 5:** Distribution of patients-specific stress as quantified by the maximum principal stress
569 at peak systole for all patients using the Yeoh constitutive material formulation based on the
570 fitting of experimental data.

571 **Figure 6:** Distribution of patients-specific stress as quantified by the maximum principal stress
572 at peak systole for all patients using the Fung constitutive material formulation based on the
573 fitting of experimental data.

574 **Figure 7:** Comparisons of stress distribution for P.3 using the material parameters obtained by
575 the FEA using the statically-determinate optimization procedure versus the FEA using patient-
576 specific material parameters.

577

578

579

580

581 **Table 1:** Patient demographic information

Patient ID	Age	Gender	Aortic Valve	Type	Systolic Diameter (mm)	Diastolic Diameter (mm)	Thickness (mm)
P.1	70	Male	BAV	AP	52.0	51.2	2.1
P.2	71	Male	TAV	/	50.4	50.8	1.9
P.3	67	Male	TAV	/	54.8	57.1	2.2
P.4	56	Male	BAV	RL	52.4	53.6	1.8
P.5	58	Male	TAV	/	42.3	45.2	2.2
P.6	67	Male	TAV	/	48.5	49.8	2.8
P.7	78	Male	TAV	/	46.5	47.8	2.1
P.8	63	Female	TAV	/	54.8	55.8	1.7
P.9	68	Male	TAV	/	44.7	45.1	2.3

582

583

584 **Table 2:** Constitutive material parameters as obtained by the fitting of experimental biaxial
 585 testing (exp) and by the elastostatic optimization procedure (opt); coefficient of determination
 586 (R^2) refer to experimental data
 587

Patient ID		Yeoh			Fung				
		c_1^y (kPa)	c_2^y (kPa)	R^2	c_1^F	a_1	a_2	a_3	R^2
P.1	exp	13.1	147.9	0.990	5.6	6.7	6.6	4.7	0.970
	opt	21.6	157.5		27.1	13.8	8.7	5.5	
P.2	exp	31.1	42.6	0.990	29.9	32.3	53.2	12.4	0.984
	opt	38.6	43.1		112.1	8.9	8.2	7.5	
P.3	exp	64.9	134.5	0.980	42.0	15.4	1.0	1.4	0.990
	opt	84.2	35.4		110.0	4.4	15.2	8.2	
P.4	exp	38.4	101.1	0.990	55.8	3.1	10.6	0.1	0.991
	opt	27.0	169.7		6.6	1.2	2.4	0.5	
P.5	exp	75.6	884.0	0.970	14.5	29.2	31.1	1.7	0.982
	opt	50.1	560.0		4.5	12.02	13.1	12.6	
P.6	exp	50.4	75.1	0.998	32.8	8.1	12.7	1.2	0.978
	opt	96.4	42.1		96.8	14.3	12.4	4.8	
P.7	exp	3.8	86.7	0.990	99.7	2.5	3.8	-0.2	0.998
	opt	55.2	32.6		15.9	14.1	15.1	3.0	
P.8	exp	15.4	242.0	0.974	5.8	21.9	20.5	-7.8	0.935
	opt	51.2	480.9		42.1	26.3	26.2	-21.0	
P.9	exp	121.8	446.8	0.968	55.6	11.0	0	0.0	0.914
	opt	163.4	240.7		54.1	14.2	66.1	30.7	

588

589

590 **Table 3:** Range of strain determined from CT imaging (ϵ_{CIRC}) and corresponding yield strain
 591 (ϵ_{yield}) extrapolated from stress-strain raw data of biaxial testing.

592

	P.1		P.2		P.3		P.4		P.5		P.6		P.7		P.8		P.9	
	min	max	min	max	min	max	min	max	min	max	min	max	min	max	min	max	min	max
ϵ_{CIRC}	0.01	0.15	0.01	0.03	0.04	0.15	0.03	0.12	0.02	0.18	0.01	0.16	0.01	0.13	0.05	0.10	0.01	0.13
ϵ_{yield}	0.16		0.24		0.25		0.17		0.15		0.09		0.21		0.17		0.08	

593

594

595

596

597 **Table 4:** Mean absolute percentage error (MAPE) of maximum principal stress between
598 experimentally-derived and optimized material parameters.

	P.1	P.2	P.3	P.4	P.5	P.6	P.7	P.8	P.9
Yeoh	0.7105	0.7398	0.7545	0.4520	0.5303	0.7034	0.2138	0.1754	0.3245
Fung	0.7683	0.1140	0.6022	0.3241	0.7539	0.7130	0.0349	0.2198	0.7034

599

600

601

602

1
2
3
4
5
6
7
8
9
10
11
12
13
14
15
16
17
18
19
20
21
22
23
24
25
26
27
28
29
30
31
32
33

On the Role of Material Properties in Ascending Thoracic Aortic Aneurysms

Federica Cosentino^{1,2}, Valentina Agnese³, Giuseppe M Raffa³, Giovanni Gentile³, Diego Bellavia³, Massimiliano Zingales⁴, Michele Pilato³, Salvatore Pasta^{2,3*}

¹ Biomedical Department of Internal Medicine and Specialities (DIBIMIS), Piazza delle Cliniche, n.2, 90128, University of Palermo, Palermo, Italy

² Fondazione Ri.MED, Via Bandiera n.11, 90133, Palermo, Italy;

³ Department for the Treatment and Study of Cardiothoracic Diseases and Cardiothoracic Transplantation, IRCCS-ISMETT, Via Tricomi n.5, 90127, Palermo, Italy

⁴ Department of Civil, Environmental, Aerospace, Materials Engineering (DICAM), Viale delle Scienze Ed.8, 90128, University of Palermo, Palermo, Italy

Conflict of interest: none

* Corresponding author:

Salvatore Pasta, PhD

Professor of Industrial Bioengineering,

Fondazione Ri.MED

Phone: +39 091 3815681

FAX: +39 091 3815682

e-mail: spasta@fondazionerimed.com

34 **Abstract:** One of the obstacles standing before the biomechanical analysis of an ascending
35 thoracic aortic aneurysm (ATAA) is the difficulty in obtaining patient-specific material properties.
36 This study aimed to evaluate differences on ATAA-related stress predictions resulting from the
37 elastostatic analysis based on the optimization of arbitrary material properties versus the
38 application of patient-specific material properties determined from *ex-vivo* biaxial testing.
39 Specifically, the elastostatic analysis relies the on the fact that, if the aortic wall stress does not
40 depend on material properties, the aorta has to be statistically determinate. Finite element
41 analysis (FEA) was applied to a group of nine patients who underwent both angio-CT imaging to
42 reconstruct ATAA anatomies and surgical repair of diseased aorta to collect tissue samples for
43 experimental material testing. Tissue samples cut from excised ATAA rings were tested under
44 equibiaxial loading conditions to obtain experimentally-derived material parameters by fitting
45 stress-strain profiles. FEAs were carried out using both optimized and experimentally-derived
46 material parameters to predict and compare the stress distribution using the mean absolute
47 percentage error (MAPE). Although physiological strains were below yield point (range of 0.08-
48 0.25), elastostatic analysis led to errors on the stress predictions that depended on the type of
49 constitutive model (highest MAPE of 0.7545 for Yeoh model and 0.7683 for Fung model) and
50 ATAA geometry (lowest MAPE of 0.0349 for patient P.7). Elastostatic analysis needs better
51 understanding of its application for determining aneurysm mechanics, and patient-specific
52 material parameters are essential for reliable accurate stress predictions in ATAAs.

53

54 **Keywords:** ascending aortic aneurysm; inverse approach, material parameters, aortic
55 aneurysm failure, finite-element analysis

56

57 INTRODUCTION

58 A ruptured ascending thoracic aortic aneurysm (ATAA) is considered a surgical emergency
59 since progressive dilatation is often fatal if this disease is not detected by diagnostic imaging
60 and managed immediately [1]. Despite being a relatively rare event with an estimated incidence
61 of 5.0 per 100,000 individuals per year, the risk of fatal complications such as rupture or acute
62 dissections can be as high as 50% in patients with a large ATAA wall (aortic diameter >50mm)
63 [2, 3]. The risk over time of ATAA development to a size of 40-45mm in patients with a
64 congenital bicuspid aortic valve (BAV) versus the morphological normal tricuspid aortic valve
65 (TAV) is remarkable. Several studies highlighted that 84% of individuals with BAV may develop
66 aortopathy during the life course [4, 5]. With regards to ATAA, degenerative aneurysms tend to
67 develop in the mid-ascending aorta and then progress distally and proximally while ATAAs
68 associated with connective tissue disorders are usually confined to the aortic root [6].

69
70 Although the aortic size criterion can be adjusted to achieve higher patient specificity using the
71 body surface area or patient height [7], the surgical dilemma still exists because fatal
72 complications can occur at aortic diameters lower than that dictated by current clinical
73 guidelines for elective repair of aneurysmal aorta [8]. There is a need to delineate additional
74 metrics, not based on aortic size, to better identify the risk of ATAA failure. Biomechanical risk
75 assessments using finite element analysis (FEA) to estimate the wall stress exerted on the
76 diseased aorta have been proposed in abdominal aortic aneurysms [9] [10] and ATAAs [11, 12].
77 These approaches for risk stratification appeared to be promising since peak wall stress can be
78 calculated from routinely performed CT scans and may be a better predictor of risk of rupture
79 than aortic diameter [13]. Recently, FEA was combined with machine learning techniques to
80 study the relationship between shape features and wall stress as risk metric of ATAA, towards
81 the development of computer-aided-diagnosis [14].

82

83 FEAs depend on several factors including the aortic geometry, the loading condition induced by
84 hemodynamic and structural loads and the material properties of aortic wall constituents.
85 Hemodynamic can be evaluated by computational fluid dynamic [15-18] or *in-vivo* 4D flow MRI
86 [19] while tracking algorithms of aortic wall surface detected by dynamic CT [20] or MRI [21] can
87 be adopted to estimate the ATAA-related structural mechanics. Obtaining material parameters
88 non-invasively during patient monitoring for preoperative risk estimations represent an important
89 challenge. However, if the stress distribution does not depend on material properties, the
90 structure has to be statically determinate [22,28]. Under this condition, we can eliminate the
91 need for patient-specific material properties and the FEA can be performed with arbitrary
92 material properties because they do not affect the resulting wall stress. Several research groups
93 adopted this approach to compute wall stress of abdominal [22] and ascending aortic
94 aneurysms [23-26].

95
96 In this proof-of-concept, we want to know how different would be the resulting stress distribution
97 on the aneurysm wall if material properties derived by an elastostatic analysis proposed by Liu
98 et al. [23] are used as compared to FEAs using patient-specific material properties determined
99 from *ex-vivo* biaxial testing. If large differences of stress distributions are observed, one could
100 raise a red flag for further investigation using this appealing approach. To accomplish this task,
101 we carried out FEAs on nine patients who underwent both dynamic CT imaging and surgical
102 elective repair of ATAA to both reconstruct aortic geometries for FEA and collect tissue samples
103 for patient-specific material property evaluation by the fitting of experimental stress-strain
104 curves. Both an isotropic- (ie, two-term Yeoh model) and an anisotropic (ie, Fung-exponential
105 model) constitutive formulation were tested. A stress comparison using the optimal material set
106 versus the experimentally-derived material set was performed, and results were discussed.

107

108 **METHODS**

109 ***Study Population***

110 All nine patients included in this investigation had electrocardiogram-gated computed
111 tomography angiography (ECG-gated CT) for the measurement of the maximum aortic diameter
112 and then elective surgical repair of dilated aortas at ISMETT IRCCS hospital institution. ECG-
113 gated CT scans were reconstructed to obtain images at both diastolic and systolic cardiac
114 phases, which were used for the estimation of the diastolic-to-systolic displacement field of the
115 aortic wall. This displacement field was used as a boundary condition for FEA as previously
116 described by our group [27]. Aortic valve shape was classified as TAV versus BAV based on
117 reconstructed images parallel to the aortic valve plane. The presence of the raphe was used to
118 group BAV morphology according to the fusion of right and left cusps (AP) as well as the fusion
119 of right and non-coronary cusp (RL). After surgical ATAA repair, excised aortic tissues were
120 stored in a physiologic solution upon biaxial mechanical testing. Table 1 shows patient
121 demographic information, pre-operative aortic diameters and thickness measurements. The
122 study was approved by the local research ethics committee, and all patients signed informed
123 consent prior enrollment.

124

125 ***Biaxial Testing***

126 Experimentally-related material properties from aneurysmal tissue samples collected for each
127 patient were estimated by equibiaxial mechanical testing using an ElectroForce TestBench
128 system (TA Instrument, Boston, MA). In brief, square specimens (10x10mm) cut from the tissue
129 region located along the major curvature of the aortic ring were extrapolated. Each specimen
130 was oriented along longitudinal and circumferential directions of the aortic vessel while sutures
131 were used to fix specimen edge using surgical staples. Thickness was measured with a caliper
132 for each sample (see Table 1). Five black markers were placed on the intimal aortic tissue
133 surface to evaluate engineering strains along testing directions using a digital video
134 extensometer placed perpendicular to the testing area. During biaxial loading, the specimen

135 was sub-merged in 0.9% physiologic saline solution in a bath under controlled temperature of
136 37°C. A small preload (0.5 grams) was set prior to the displacement-driven testing protocol and,
137 after preconditioning, a constant speed of 1mm/min was applied to four electromagnetic motors
138 for loading the specimen under equibiaxial condition. Two 200N load cells were used to record
139 forces along material directions. Data analysis to obtain stress and strain were calculated as
140 defined in the constitutive modeling section.

141

142 ***Constitutive Modeling***

143 FEAs were carried out using two specific classes of materials: a) the isotropic Yeoh material
144 model in the two-term formulation proposed by Raghavan and Vorp [9] for abdominal aortic
145 aneurysms, and b) the orthotropic Fung-exponential model that is often used in soft tissue
146 biomechanics. Both models adopt homogenous, incompressible and hyperplastic description of
147 ATAA wall mechanics.

148

149 In short, the two-term Yeoh constitutive model relates the stress tensors (S) in the loaded
150 specimen to the stretch (λ) through the equation:

$$151 \quad S_{11} = S_{22} = \left[2 c_1^{(Y)} + 4 c_2^{(Y)} (\lambda^2 + 2 \lambda^{-1} - 3) \right] [\lambda^2 - \lambda^{-1}] \quad (1)$$

152 with $c_1^{(Y)}$ and $c_2^{(Y)}$ are material model parameters indicative of the mechanical properties of the
153 ATAA wall, and λ is equal to the deformed specimen length divided by the original length.

154 $S_{33} = 0$ according to the membrane stress state assumption adopted in our FEA approach.

155

156 The free energy function for the Fung model was:

$$157 \quad \hat{r}(\mathbf{C}) = \frac{c_1^{(F)}}{2} \left[\exp[Q(\mathbf{C})] - 1 \right] \quad (2)$$

158 with $[c_1^{(F)}] = F/L$ the material-like parameter , $\mathbf{C} = \mathbf{F}^T \mathbf{F}$ the right Cauchy-Green strain tensor

159 while the material-dependent exponent, $Q(\mathbf{C})$, was a quadratic form of Cauchy-Green strain

160 tensor $\mathbf{C} = \mathbf{F}^T \mathbf{F}$:

$$161 \quad Q(\mathbf{C}) = a_1 I_1^2 + a_2 I_2^2 + 2a_3 I_1 I_2 \quad (3)$$

162 with a_1, a_2, a_3 the dimensionless parameter.

163

164 The Cauchy stresses of Fung constitutive formulation are therefore expressed as:

$$\begin{aligned} \sigma_{11} &= 2\lambda_1^2 c_1^{(F)} e^Q (a_1 \lambda_1 + a_3 \lambda_2) \\ \sigma_{22} &= 2\lambda_2^2 c_1^{(F)} e^Q (a_3 \lambda_1 + a_2 \lambda_2) \end{aligned} \quad (4 \text{ a,b})$$

165 **Constitutive Material Parameter Estimation**

166 The elastostatic analysis for the evaluation of material constitutive parameters proposed by Liu

167 et al [23] is based on the main premise for which the stress distribution is statically determinate.

168 Thus, for a given ATAA deformed configuration (ie, peak of systole) and known loading

169 condition (ie, the diastolic-to-systolic displacement field), different material parameters and

170 constitutive models will give nearly the same stress field. In this way, an “almost-true” stress

171 field at systole can be approximately obtained by an infinitesimal linear elastic model with

172 sufficiently stiff material parameters. This fact has been theoretically justified by Miller and Lu

173 [28] and numerically verified by Lu et al. [29] and Joldes et al. [22]. Given the constitutive model

174 with an initial guess of material parameters (ie, $c_1^{(y)}$ and $c_2^{(y)}$ for Yeoh model and $c_1^{(F)}$, a_1 , a_2 , a_3

175 for the Fung model), by using the constitutive equations and deformation relationship between

176 the two loading states, an optimization algorithm allows to find the “true” material parameters

177 such that the difference between the estimated and “almost-true” stress fields is minimized.

178 Thus, the objective of the optimization process was to find a set of material descriptors that

179 minimize the difference between the “almost-true” systolic stress, $\tilde{\sigma}^t$, and estimated systolic
 180 stress, $\tilde{\sigma}^{est}$, for each element as:

$$\begin{aligned} \mathbf{g}_e^{(Y)} &= \sum_{m=1}^N \sum_{i=1}^2 \left[\tilde{S}_i^{(t)} - \tilde{S}_i^{(e)}(c_1^{(Y)}, c_2^{(Y)}) \right]^2 \\ \mathbf{g}_e^{(F)} &= \sum_{m=1}^N \sum_{i=1}^2 \left[\tilde{S}_i^{(t)} - \tilde{S}_i^{(F)}(c_1^{(F)}, a_1, a_2, a_3) \right]^2 \end{aligned} \quad (5 \text{ a,b})$$

181 where N is the number of elements used in each model and i is the component index of each
 182 principal stress component. Eq. 1 and Eq. 4 were used for the estimated systolic stress of Yeoh
 183 and Fung models, respectively.

184

185 The optimization was implemented in the mathematical language program, MATLAB (v2018,
 186 Mathworks, MA, USA). Nonlinear least-squares algorithm with trust-region-reflective was used
 187 for the optimization of Yeoh material parameters using $c_1^{(Y)} > 0$ and $c_2^{(Y)} > 0$ as lower bounds. For
 188 the Fung-exponential form, physically meaningful and plausible material parameters were
 189 obtained by enforcing the convexity of the strain energy function and thus performing
 190 constrained minimization. For planar biaxial loading of soft tissue, strict convexity physically
 191 implies that the projections of the contour of $f(\mathbf{C})$ on the $I_1 - I_2$ plane form a convex surface
 192 [30]. It can be shown that if $c_1^{(F)} > 0$, then Eq. 4 is likely convex if and only if $a_1 > 0$, $a_2 > 0$ and
 193 $a_1 a_2 - a_3^2 > 0$

194

195 For the estimation of the “almost-true” systolic stress distribution, we selected a very stiff
 196 material for the aortic wall ($E=2 \times 10^4$ GPa and $\nu=0.49$) to obtain Cauchy stress. As initial guess
 197 of material descriptors, we used the population-average material properties reported by Pasta et
 198 al. [31] for the two-term Yeoh model and by Azdani et al. [32] for the Fung model of ATAAs. For

199 each optimization procedure, principal stresses were imported in MATALB by postprocessing of
200 ABAQUS models, and the optimization was done to obtain the optimal material parameters.
201

202 ***Computational Study***

203 ECG-gated CT images were used to segment the ATAA wall at both end-diastolic and peak-
204 systolic cardiac phases using the medical imaging software Mimics (Mimics v20, Materialise,
205 Leuven, BE) [15, 33]. Semi-automatic threshold-based segmentation of aortic lumen allowed us
206 to obtain a point cloud (resolution of 0.3 mm), which was triangulated to generate a surface
207 mesh of both diastolic and systolic ATAA geometries. Using an algorithm previously developed
208 by our group in MATLAB (v2018, Mathworks, MA, USA), the point cloud of the diastolic aortic-
209 luminal surface was projected normally onto the systolic aortic-luminal surface to determine the
210 displacement field as the Euclidean distance between closest points [15]. The estimated
211 diastolic-to-systolic displacement field was then implemented as a boundary condition in the
212 FEA model for estimating wall stresses.

213
214 For each patient, FEAs were developed using the reconstructed ATAA geometry at diastole,
215 which was meshed with quadrilateral (M3D4R) and triangular (M3D3) membrane elements in
216 ABAQUS/Explicit (v2018, SIMULIA Inc, Providence, RI). Reduced integration was used for the
217 4-node quadrilateral membrane element. Grid convergence led to an element size of 0.7mm
218 (element range of 28,200-37,500) to obtain a reproducible stress analysis of the human thoracic
219 aorta [34]. Uniform material properties were adopted for the aortic wall while thickness
220 measured from tissue samples was set for each patient simulation. Distal ends of the
221 descending aorta and supra-aortic vessels were fixed in all directions. Material fiber direction
222 was set using multiple cylindrical coordinate systems with origins in the centerline of the
223 aneurysmal aorta. The ATAA wall was modeled using two constitute formulations to assess the

224 role of the isotropic- and anisotropic material behavior on the resulting stress distribution. The
225 density of the aortic tissue was 1060 kg/m^3 . In the Abaqus/Explicit solver, ATAA wall mechanics
226 was modeled as a quasi-static process while the energy was monitored to ensure the ratio of
227 kinetic energy to internal energy remains less than 10%. Adequate time step was applied while
228 an element-by-element stable time increment estimate, coupled with a “variable mass scaling
229 technique,” reduced the computational cost of each simulation. Mass scaling was performed by
230 scaling the masses of elements whose stable time increments was less than the user-supplied
231 time increment of $1.e-7 \text{ s}$ so that the element stable time increment for these elements becomes
232 equal to the user-supplied time increment. This approach has a minor effect on the stress
233 analysis.

234

235 The numerical strategy is here summarized:

- 236 1. For the estimation of the “almost-true” stress distribution, the FEA model of each patient
237 was loaded with a uniform peak systolic pressure distribution of 120mmHg in a very stiff
238 aortic wall ($E=2 \times 10^4 \text{ GPa}$ and $\nu=0.49$). This approach led to infinitesimal deformation of
239 aneurysmal aorta.
- 240 2. The resulting “almost-true” stress distribution was adopted to optimize the population-
241 average material descriptors of Yeoh and Fung constitutive relationships. This step
242 allowed us to find the optimal material parameters specific to a given patient geometry.
- 243 3. A second set of simulations was performed using the optimal material properties and
244 the diastolic-to-systolic displacement field (instead of the uniform pressure distribution)
245 to find realistic deformation of ATAA wall.
- 246 4. A third set of simulations was carried out using the displacement field as the boundary
247 condition but using the experimental material properties evaluated from *ex-vivo* material
248 testing. Then, results were compared to those observed for the second set of
249 simulations.

250

251 **RESULTS**

252 Experimental biaxial testing

253 Experimental raw data from equibiaxial testing are shown as Piola-Kirchhoff stress versus
254 engineering-strain plots for ATAAs in both circumferential and longitudinal directions of
255 ascending aorta (Figure 1). Most of stress-strain data presented a linear part, related to the
256 elastic properties of the aneurysmal aortic tissue, followed by an exponential part related to the
257 collagen fiber recruitment. These parts were separated by the “yield point”, which is more likely
258 to define the *in-vivo* stress range. For a given tissue specimen, there was no remarkable
259 difference of material response between longitudinal and circumferential directions, suggesting
260 isotropic mechanical behavior for ATAA wall as previously found [31]. Stress-strain data were
261 successfully fit by both the isotropic and anisotropic constitutive models, and the material
262 parameters for each patient were estimated (Table 2). Fitting was able to accurately reproduce
263 the non-linear behavior of experimental data ($R^2 > 0.91$ in all cases) so that material descriptors
264 can be considered as determinants of the biomechanical behavior of ATAA wall. After running
265 the elastostatic optimization analysis, material parameters were found close to those obtained
266 from the fitting of the experimental stress-strain curves. We observed that even a variation of
267 10% on the initial guess of the constitutive parameter set did not determine remarkable changes
268 on the optimal material parameters.

269

270 Strain analysis

271 Figure 2 shows the distribution of diastolic-to-systolic strain field as well as the experimental
272 stress-strain curve from biaxial testing of the aortic tissue specimen cut from the same patient. It
273 can be observed that the range of “true” strain in the circumferential direction is below the yield
274 strain, which is the value of the strain at yield point before reaching the steep increase in the
275 stress-strain response of tested aortic tissue specimen. Most of patients experienced low strain

276 at CT imaging, except for patients P.6 and P.9 who experience strains remarkably above the
277 yield strain (Table 3). This can be determined by high blood pressure induced by hypertension,
278 increased stretch and twist of aortic vessel due to heart beating and local changes of material
279 properties or tissue thickness, exposing the aneurysmal aorta at greater risk of complications
280 than other patients.

281

282 "Almost-true" stress computation

283 The distribution of "almost-true" stress determined by the simple linear-elastic FEA with the stiff
284 elastic modulus was compared to that obtained at the end of optimization procedure for each
285 patient simulation. Specifically, the maximum principal stress exerted on the ATAA wall was
286 used as an indicator of intramural stress of aneurysmal aorta. Figure 3 shows that the stiff ATAA
287 model had a stress distribution similar to that of Fung model but different from that shown by the
288 Yeoh model. The mean absolute percentage error (MAPE) was calculated for each patient as a
289 measure of differences among simulation approaches. For the patient P.1 shown in Figure 3,
290 the MAPE was nearly 30% between the "almost-true" and Yeoh models and 8.5% between the
291 "almost-true" and Fung models. For other patient cases, we found errors in the range of 6-18%.

292

293 Biaxial testing of optimal vs experimental material parameters

294 Optimized material parameters obtained from elastostatic analysis were used to determine the
295 stress-strain response under equibiaxial loading conditions in a FEA reproducing the
296 experimental testing of aortic tissue sample. Then, the stress-strain curves were plotted
297 together with the experimental testing data (see Figure 4). P.2 with small strain field exhibited a
298 practically equivalent stress-strain response with both experimental and elastostatic material
299 descriptors. At strain of 14%, P.6 had the largest discrepancy of 24% in stress predictions
300 between optimized and experimental material descriptors of two-term Yeoh constitutive model.

301

302 Patient-specific FEA of optimal vs experimental material parameters

303 Figure 5 illustrates predicted wall stress distributions computed by patient-specific material
304 descriptors determined from experimental biaxial testing of Yeoh model. Local maxima of wall
305 stress were mainly placed near the maximum curvature of the ascending aorta, just above the
306 sino-tubular junction. In a similar way, Figure 6 shows predicted wall stress maps resulting from
307 the experimentally-based material fitting using the Fung model. It can be observed that stress
308 distributions are similar among constitutive formulations (ie, Yeoh versus Fung model) when
309 patient-specific material parameters are adopted.

310

311 Although biaxial testing results of optimal versus experimental material parameters are
312 encouraging, we found considerable discrepancies for the patient-specific stress predictions
313 between the optimal material parameter set versus the experimentally-derived set (Figure 7).
314 The MAPE was calculated for each patient and evinced highly variable differences from patient
315 to patient and the type of constitutive formulation (see Table 4).

316

317 **DISCUSSION**

318 In this study, we exploited the appealing concept of obtaining reasonably and accurate stress
319 solutions of aneurysm mechanics using an inverse approach, and thus without invoking
320 accurate material descriptors that are hard to know before surgical management of ATAAs. We
321 optimized population-average material parameters with respect to an “the “almost-true” stress
322 fields obtained with an infinitesimal linear-elastic model based on a sufficiently stiff Young
323 modulus [23]. The so-recovered material parameters were implemented in FEAs, and then
324 stress distributions of nine ATAA geometries were compared to those predicted when patient-
325 specific material descriptors are estimated from the fitting of *ex-vivo* testing data of aortic tissue
326 specimens collected from the same patient. We observed that the stress-strain response under
327 equibiaxial loading predicted by the elastostatic analysis was consistent to the experimental

328 material behavior if strain was low (largest difference of 24% at strain of 14%). This was in
329 agreement with findings documented by Liu et al. [23]. However, the discrepancy on predicted
330 stress distributions was considerably, depending on the adopted constitutive model and ATAA
331 shape, when FEAs were performed on patient anatomies. Although the stress analysis of
332 abdominal aortic aneurysms did not depend on material properties [22], the modeling of the
333 ascending aorta as a statically-determinate structure needs further understanding so that the
334 role of material properties is still important for realistic and accurate stress predictions.

335

336 Identification of patient-specific material parameters of ATAAs deserves important interest as
337 FEAs rely on population-average values of material properties for those patients undergoing
338 close monitoring of the aneurysm size. In risk predictions of aneurysm failure, FEAs based on
339 patient-specific material descriptors were carried out in very few studies restricted to patients
340 who underwent elective surgical repair of ATAA wall to derive the material behavior from
341 uniaxial or bulge inflation tests [11, 12]. The role of material properties in computational growth
342 and remodeling analyses may be even more remarkable as stress estimations are strongly
343 dependents on local material changes [35].

344

345 To avoid *ex-vivo* material testing, inverse approaches allows to estimate material descriptors;
346 however, inverse analysis involves a complex non-linear problem [36, 37]. Most of inverse
347 techniques proposed for soft tissue mechanics attempt to minimize a cost function defined by
348 the difference between a target parameter, which is determined from medical image analysis,
349 and a candidate parameter estimated from FEA and then iteratively adjusted to tune material
350 parameters of interest [38]. However, inverse approaches are commonly time consuming due to
351 continuous interaction with the FEA solver [39]. For the ascending aorta, Trabelsi et al. [38]
352 proposed an inverse method in which the target variable was the volume variation of the aorta
353 measured from ECG-gated CT scans. They assumed a linear relationship between the

354 constitutive material parameter and the volume of the aortic luminal surface, and then carried
355 out eight FEA analyses for each patient to build datasets for several CT measurements of ATAA
356 volume at systole and mid-cardiac phase. The error attributed to this approach was 0.6% on
357 estimated CT volume and 9.6% on the predicted stress response under equibiaxial test
358 simulations. In agreement with our findings, the statically determinate inverse approach
359 proposed by Liu et al. [23] for the Gasser-Holzapfel-Ogden constitutive model demonstrated
360 comparable biaxial stress-strain curves between elastostatic analyses and experimental tests
361 estimated in a previous investigation of the same group [11]. In their patient study group,
362 patient-specific FEAs on ATAA anatomies were not done because of lack of both CT and tissue
363 data, without quantification of stress changes computed with either experimental or elastostatic-
364 based material parameters.

365

366 Generally, the stress of a deformable body depends not only on its geometry, load and
367 boundary conditions, but also on the mechanical properties of constituents. One of the
368 obstacles standing before the biomechanics community is the difficulty in obtaining patient-
369 specific properties of tissues given the absence of a methodology to non-invasively estimate
370 stress *in-vivo*. Notwithstanding, there is an emerging interest from several groups in
371 reformulating computational mechanics in a new paradigm so that computational stress
372 predictions are weakly sensitive to the variation of mechanical properties when the deformed
373 configuration is given [28]. This paradigm can apply to non-linear elastic material, because the
374 stress in such material depends on the relative deformation among two definite configurations. If
375 one of them is known, the other can be solved from equilibrium, which is dominated by in-plane
376 stress for thin-walled structure treated as a membrane. From the analysis of ECG-gated CT
377 images, we observed that strain at deformed configuration bears to the linear-elastic part of the
378 experimental stress-strain response (see Table 3), thereby supporting in part the static
379 determinacy of the aneurysmal wall. In this way, the inverse problem can be directly formulated

380 using the constitutive law as here presented or shown by other studies [23, 40] and without the
381 need of a continuous interaction with the FEA solver. Using the Fung model, Miller et al. [28]
382 investigated the sensitivity of the stress solution with respect to material parameters and
383 constitutive model in three intracranial aneurysm geometries under static determinacy. The
384 inverse stress solution was far less sensitive to material description as, for instance, the 100
385 times increase in the stiffness parameter C of the Fung model led to a 2.9% error in the
386 maximum principal stress prediction. As compared to abdominal or cerebral aneurysms, the
387 ascending aorta is cyclically stretched and twisted every heartbeat by determining the presence
388 of longitudinal and shear stresses in a way that the static equilibrium is not only governed by the
389 internal pressure. These mechanical forces are also highly dynamic (as systole is approximately
390 0.33s), thereby determining viscoelastic effects. These factors combined to residual stress likely
391 occurring in blood vessels can pose several doubts on the modeling of the ascending aorta as
392 statically-determinate structure.

393

394 The major limitation of this study is that comparisons of stress predictions were carried out
395 assuming the experimentally-derived material parameters as the true material descriptors of the
396 ATAA wall, but these can be indeed different from the *in-vivo* condition. However, there is no
397 methodology to *in-vivo* estimate the material behavior so that experimental material parameters
398 are the most accurate ATAA material descriptors. FEAs were based on homogenous thickness
399 and material properties for the whole aorta but there exist evidence of regional changes in the
400 material properties and thickness along the vessel circumference [41] and from the aortic root to
401 the distal ascending aorta [42]. It should be mentioned that the optimization procedure can be
402 modified to account for heterogenous thickness and regionally-dependent material properties by
403 slightly altering the workflow and evaluating the objective function element-by-element.
404 Disregarding the presence of residual stresses and considering the arterial wall as a 3D
405 membrane with uniform thickness can be considered as additional limitations of the current

406 work. It was assumed that the aortic wall behaves as a membrane with no bending moments or
407 no through thickness shear, although regions near the branches may not satisfy the membrane
408 assumption. The orientation of elastic fiber was not considered in FEAs, and this may alter the
409 stress distribution as demonstrated in a previous study [31]. Caliper-based measurements of
410 tissue thickness can lead to errors which in turn affect aortic wall stress predictions.

411

412 **CONCLUSION**

413 We conclude that the modeling of the ascending aorta as a statically determinate can lead to
414 errors on wall stress predictions in patient-specific FEAs since aortic wall stress was found to
415 depend on the type of constitutive model and ATAA geometry. Static determinacy needs better
416 understanding of its application to determine ascending aortic aneurysm mechanics so that
417 patient-specific material descriptors as determined by *ex-vivo* material testing are advocated for
418 reliable accurate stress predictions of ATAA wall mechanics.

419

420 **ACKNOWLEDGMENTS**

421 This work was supported by a “Ricerca Finalizzata” grant from the Italian Ministry of Health (GR-
422 2011-02348129) as well as by a grant from Fondazione RiMED to Salvatore Pasta. Federica
423 Cosentino thanks the Fondazione RiMED and Ministry of Education, University and Research
424 (MIUR) for supporting her PhD programme.

425 **REFERENCES**

- 426 [1] L.K. Bickerstaff, P.C. Pairolero, L.H. Hollier, L.J. Melton, H.J. Van Peenen, K.J. Cherry, J.W.
427 Joyce, J.T. Lie, Thoracic aortic aneurysms: a population-based study, *Surgery*, 92 (1982)
428 1103-1108.
- 429 [2] M.A. Coady, J.A. Rizzo, G.L. Hammond, D. Mandapati, U. Darr, G.S. Kopf, J.A. Elefteriades,
430 O.W. Isom, F. Robicsek, R.B. Griepp, What is the appropriate size criterion for resection of
431 thoracic aortic aneurysms?, *Journal of Thoracic and Cardiovascular Surgery*, 113 (1997)
432 476-491.
- 433 [3] J.A. Beckman, Aortic aneurysms: pathophysiology, epidemiology and prognosis, in: M.A.
434 Creager, V.J. Dzau, J. Loscalzo (Eds.) (eds): *Vascular Medicine*, Saunders Elsevier,
435 Philadelphia, PA, 2006.
- 436 [4] S. Verma, S.C. Siu, Aortic dilatation in patients with bicuspid aortic valve, *N Engl J Med*, 370
437 (2014) 1920-1929.
- 438 [5] M.A. Borger, P.W.M. Fedak, E.H. Stephens, T.G. Gleason, E. Girdauskas, J.S. Ikonomidis,
439 A. Khoynzhad, S.C. Siu, S. Verma, M.D. Hope, D.E. Cameron, D.F. Hammer, J.S. Coselli,
440 M.R. Moon, T.M. Sundt, A.J. Barker, M. Markl, A. Della Corte, H.I. Michelena, J.A.
441 Elefteriades, The American Association for Thoracic Surgery consensus guidelines on
442 bicuspid aortic valve-related aortopathy: Full online-only version, *J Thorac Cardiovasc Surg*,
443 156 (2018) e41-e74.
- 444 [6] A. Della Corte, C. Bancone, C. Quarto, G. Dialetto, F.E. Covino, M. Scardone, G. Caianiello,
445 M. Cotrufo, Predictors of ascending aortic dilatation with bicuspid aortic valve: a wide
446 spectrum of disease expression, *Eur J Cardiothorac Surg*, 31 (2007) 397-404; discussion
447 404-395.
- 448 [7] J.A. Elefteriades, E.A. Farkas, Thoracic aortic aneurysm clinically pertinent controversies
449 and uncertainties, *J Am Coll Cardiol*, 55 (2010) 841-857.

- 450 [8] L.A. Pape, T.T. Tsai, E.M. Isselbacher, J.K. Oh, P.T. O'Gara, A. Evangelista, R. Fattori, G.
451 Meinhardt, S. Trimarchi, E. Bossone, T. Suzuki, J.V. Cooper, J.B. Froehlich, C.A. Nienaber,
452 K.A. Eagle, Aortic diameter ≥ 5.5 cm is not a good predictor of type A aortic dissection -
453 Observations from the international registry of acute aortic dissection (IRAD), *Circulation*, 116
454 (2007) 1120-1127.
- 455 [9] M.L. Raghavan, D.A. Vorp, Toward a biomechanical tool to evaluate rupture potential of
456 abdominal aortic aneurysm: identification of a finite strain constitutive model and evaluation
457 of its applicability, *Journal of Biomechanics*, 33 (2000) 475-482.
- 458 [10] M.F. Fillinger, S.P. Marra, M.L. Raghavan, F.E. Kennedy, Prediction of rupture risk in
459 abdominal aortic aneurysm during observation: Wall stress versus diameter, *J Vasc Surg*, 37
460 (2003) 724-732.
- 461 [11] C. Martin, W. Sun, T. Pham, J. Elefteriades, Predictive biomechanical analysis of ascending
462 aortic aneurysm rupture potential, *Acta Biomater*, 9 (2013) 9392-9400.
- 463 [12] O. Trabelsi, F.M. Davis, J.F. Rodriguez-Matas, A. Duprey, S. Avril, Patient specific stress
464 and rupture analysis of ascending thoracic aneurysms, *J Biomech*, 48 (2015) 1836-1843.
- 465 [13] A.K. Venkatasubramaniam, M.J. Fagan, T. Mehta, K.J. Mylankal, B. Ray, G. Kuhan, I.C.
466 Chetter, P.T. McCollum, A comparative study of aortic wall stress using finite element
467 analysis for ruptured and non-ruptured abdominal aortic aneurysms, *European Journal of*
468 *Vascular and Endovascular Surgery*, 28 (2004) 168-176.
- 469 [14] L. Liang, M. Liu, C. Martin, J.A. Elefteriades, W. Sun, A machine learning approach to
470 investigate the relationship between shape features and numerically predicted risk of
471 ascending aortic aneurysm, *Biomech Model Mechanobiol*, 16 (2017) 1519-1533.
- 472 [15] S. Pasta, G. Gentile, G.M. Raffa, D. Bellavia, G. Chiarello, R. Liotta, A. Luca, C. Scardulla,
473 M. Pilato, In Silico Shear and Intramural Stresses are Linked to Aortic Valve Morphology in
474 Dilated Ascending Aorta, *European journal of vascular and endovascular surgery : the official*
475 *journal of the European Society for Vascular Surgery*, 54 (2017) 254-263.

- 476 [16] A. Rinaudo, S. Pasta, Regional variation of wall shear stress in ascending thoracic aortic
477 aneurysms, Proceedings of the Institution of Mechanical Engineers. Part H, Journal of
478 engineering in medicine, 228 (2014) 627-638.
- 479 [17] J.J. Lee, G. D'Ancona, A. Amaducci, F. Follis, M. Pilato, S. Pasta, Role of computational
480 modeling in thoracic aortic pathology: a review, J Card Surg, 29 (2014) 653-662.
- 481 [18] G. D'Ancona, A. Amaducci, A. Rinaudo, S. Pasta, F. Follis, M. Pilato, R. Baglini,
482 Haemodynamic predictors of a penetrating atherosclerotic ulcer rupture using fluid-structure
483 interaction analysis, Interactive cardiovascular and thoracic surgery, 17 (2013) 576-578.
- 484 [19] A.J. Barker, C. Lanning, R. Shandas, Quantification of Hemodynamic Wall Shear Stress in
485 Patients with Bicuspid Aortic Valve Using Phase-Contrast MRI, Annals of Biomedical
486 Engineering, 38 (2010) 788-800.
- 487 [20] S. Pasta, V. Agnese, M. Di Giuseppe, G. Gentile, G.M. Raffa, D. Bellavia, M. Pilato, In Vivo
488 Strain Analysis of Dilated Ascending Thoracic Aorta by ECG-Gated CT Angiographic
489 Imaging, Annals of biomedical engineering, 45 (2017) 2911-2920.
- 490 [21] H. Haraldsson, M. Hope, G. Acevedo-Bolton, E. Tseng, X. Zhong, F.H. Epstein, L. Ge, D.
491 Saloner, Feasibility of asymmetric stretch assessment in the ascending aortic wall with
492 DENSE cardiovascular magnetic resonance, J Cardiovasc Magn Reson, 16 (2014) 6.
- 493 [22] G.R. Joldes, K. Miller, A. Wittek, B. Doyle, A simple, effective and clinically applicable
494 method to compute abdominal aortic aneurysm wall stress, J Mech Behav Biomed Mater, 58
495 (2016) 139-148.
- 496 [23] M. Liu, L. Liang, W. Sun, A new inverse method for estimation of in vivo mechanical
497 properties of the aortic wall, J Mech Behav Biomed Mater, 72 (2017) 148-158.
- 498 [24] S. Farzaneh, O. Trabelsi, S. Avril, Inverse identification of local stiffness across ascending
499 thoracic aortic aneurysms, Biomech Model Mechanobiol, (2018).

- 500 [25] L. Liang, M. Liu, C. Martin, W. Sun, A deep learning approach to estimate stress
501 distribution: a fast and accurate surrogate of finite-element analysis, *J R Soc Interface*, 15
502 (2018).
- 503 [26] B.J. Doyle, P.E. Norman, P.R. Hoskins, D.E. Newby, M.R. Dweck, Wall Stress and
504 Geometry of the Thoracic Aorta in Patients With Aortic Valve Disease, *Ann Thorac Surg*, 105
505 (2018) 1077-1085.
- 506 [27] V. Mendez, M. Di Giuseppe, S. Pasta, Comparison of hemodynamic and structural indices
507 of ascending thoracic aortic aneurysm as predicted by 2-way FSI, CFD rigid wall simulation
508 and patient-specific displacement-based FEA, *Computers in Biology and Medicine*, 100
509 (2018) 221-229.
- 510 [28] K. Miller, J. Lu, On the prospect of patient-specific biomechanics without patient-specific
511 properties of tissues, *J Mech Behav Biomed Mater*, 27 (2013) 154-166.
- 512 [29] J. Lu, X.L. Zhou, M.L. Raghavan, Inverse method of stress analysis for cerebral aneurysms,
513 *Biomechanics and Modeling in Mechanobiology*, 7 (2008) 477-486.
- 514 [30] G.A. Holzapfel, T.C. Gasser, R.W. Ogden, A new constitutive framework for arterial wall
515 mechanics and a comparative study of material models, *Journal of Elasticity*, 61 (2000) 1-48.
- 516 [31] S. Pasta, J.A. Phillippi, A. Tsamis, A. D'Amore, G.M. Raffa, M. Pilato, C. Scardulla, S.C.
517 Watkins, W.R. Wagner, T.G. Gleason, D.A. Vorp, Constitutive modeling of ascending
518 thoracic aortic aneurysms using microstructural parameters, *Med Eng Phys*, 38 (2016) 121-
519 130.
- 520 [32] A.N. Azadani, S. Chitsaz, A. Mannion, A. Mookhoek, A. Wisneski, J.M. Guccione, M.D.
521 Hope, L. Ge, E.E. Tseng, Biomechanical properties of human ascending thoracic aortic
522 aneurysms, *Ann Thorac Surg*, 96 (2013) 50-58.
- 523 [33] S. Pasta, A. Rinaudo, A. Luca, M. Pilato, C. Scardulla, T.G. Gleason, D.A. Vorp, Difference
524 in hemodynamic and wall stress of ascending thoracic aortic aneurysms with bicuspid and
525 tricuspid aortic valve, *J Biomech*, 46 (2013) 1729-1738.

526 [34] D.P. Nathan, C. Xu, J.H. Gorman III, R.M. Fairman, J.E. Bavaria, R.C. Gorman, K.B.
527 Chandran, B.M. Jackson, Pathogenesis of acute aortic dissection: a finite element stress
528 analysis, *Ann Thorac Surg*, 91 (2011) 458-463.

529 [35] G. Martufi, T.C. Gasser, J.J. Appoo, E.S. Di Martino, Mechano-biology in the thoracic aortic
530 aneurysm: a review and case study, *Biomech Model Mechanobiol*, 13 (2014) 917-928.

531 [36] J.E. Zelaya, S. Goenezen, P.T. Dargon, A.F. Azarbal, S. Rugonyi, Improving the efficiency
532 of abdominal aortic aneurysm wall stress computations, *Plos One*, 9 (2014) e101353.

533 [37] J. Biehler, M.W. Gee, W.A. Wall, Towards efficient uncertainty quantification in complex
534 and large-scale biomechanical problems based on a Bayesian multi-fidelity scheme,
535 *Biomech Model Mechanobiol*, 14 (2015) 489-513.

536 [38] O. Trabelsi, A. Duprey, J.P. Favre, S. Avril, Predictive Models with Patient Specific Material
537 Properties for the Biomechanical Behavior of Ascending Thoracic Aneurysms, *Ann Biomed*
538 *Eng*, 44 (2016) 84-98.

539 [39] A. Wittek, K. Karatolios, C.P. Fritzen, J. Bereiter-Hahn, B. Schieffer, R. Moosdorf, S. Vogt,
540 C. Blase, Cyclic three-dimensional wall motion of the human ascending and abdominal aorta
541 characterized by time-resolved three-dimensional ultrasound speckle tracking, *Biomech*
542 *Model Mechanobiol*, 15 (2016) 1375-1388.

543 [40] M. Peirlinck, M. De Beule, P. Segers, N. Rebelo, A modular inverse elastostatics approach
544 to resolve the pressure-induced stress state for in vivo imaging based cardiovascular
545 modeling, *J Mech Behav Biomed Mater*, 85 (2018) 124-133.

546 [41] D.C. Iliopoulos, R.P. Deveja, E.P. Kritharis, D. Perrea, G.D. Sionis, K. Toutouzas, C.
547 Stefanadis, D.P. Sokolis, Regional and directional variations in the mechanical properties of
548 ascending thoracic aortic aneurysms, *Medical Engineering & Physics*, 31 (2009) 1-9.

549 [42] A.N. Azadani, S. Chitsaz, P.B. Matthews, N. Jaussaud, J. Leung, T. Tsinman, L. Ge, E.E.
550 Tseng, Comparison of mechanical properties of human ascending aorta and aortic sinuses,
551 *Ann Thorac Surg*, 93 (2012) 87-94.

553 **Figure Legends**

554 **Figure 1:** Equibiaxial raw stress-strain data for ATAA specimens in (A) circumferential (CIRC)
555 and (B) longitudinal (LONG) directions; labels indicate specimens obtained from same patient

556 **Figure 2:** Representative distribution of circumferential strain for patient P.2 as obtained after
557 optimization procedure and raw stress-strain data in the circumferential direction showing the
558 range of strain.

559 **Figure 3:** Distribution of “almost-true” stress determined using a very stiff material for the aortic
560 wall as compared to stress from the optimal material properties for the Yeoh and Fung
561 constitutive models of P.1

562 **Figure 4:** Comparison of stress-strain response curves under equibiaxial loading condition for
563 three representative patients as modeled with two-term Yeoh constitutive model (top row) and
564 Fung-exponential model (bottom row) using experimental and optimized material parameters;
565 dots indicates maximum value of peak systolic strain

566 **Figure 5:** Distribution of patients-specific stress as quantified by the maximum principal stress
567 at peak systole for all patients using the Yeoh constitutive material formulation based on the
568 fitting of experimental data.

569 **Figure 6:** Distribution of patients-specific stress as quantified by the maximum principal stress
570 at peak systole for all patients using the Fung constitutive material formulation based on the
571 fitting of experimental data.

572 **Figure 7:** Comparisons of stress distribution for P.3 using the material parameters obtained by
573 the FEA using the statically-determinate optimization procedure versus the FEA using patient-
574 specific material parameters.

575

576

577

578

579 **Table 1:** Patient demographic information

Patient ID	Age	Gender	Aortic Valve	Type	Systolic Diameter (mm)	Diastolic Diameter (mm)	Thickness (mm)
P.1	70	Male	BAV	AP	52.0	51.2	2.1
P.2	71	Male	TAV	/	50.4	50.8	1.9
P.3	67	Male	TAV	/	54.8	57.1	2.2
P.4	56	Male	BAV	RL	52.4	53.6	1.8
P.5	58	Male	TAV	/	42.3	45.2	2.2
P.6	67	Male	TAV	/	48.5	49.8	2.8
P.7	78	Male	TAV	/	46.5	47.8	2.1
P.8	63	Female	TAV	/	54.8	55.8	1.7
P.9	68	Male	TAV	/	44.7	45.1	2.3

580

581

582 **Table 2:** Constitutive material parameters as obtained by the fitting of experimental biaxial
583 testing (exp) and by the elastostatic optimization procedure (opt); coefficient of determination
584 (R^2) refer to experimental data
585

Patient ID		Yeoh			Fung				
		c_1^y (kPa)	c_2^y (kPa)	R^2	c_1^F	a_1	a_2	a_3	R^2
P.1	exp	13.1	147.9	0.990	5.6	6.7	6.6	4.7	0.970
	opt	21.6	157.5		27.1	13.8	8.7	5.5	
P.2	exp	31.1	42.6	0.990	29.9	32.3	53.2	12.4	0.984
	opt	38.6	43.1		112.1	8.9	8.2	7.5	
P.3	exp	64.9	134.5	0.980	42.0	15.4	1.0	1.4	0.990
	opt	84.2	35.4		110.0	4.4	15.2	8.2	
P.4	exp	38.4	101.1	0.990	55.8	3.1	10.6	0.1	0.991
	opt	27.0	169.7		6.6	1.2	2.4	0.5	
P.5	exp	75.6	884.0	0.970	14.5	29.2	31.1	1.7	0.982
	opt	50.1	560.0		4.5	12.02	13.1	12.6	
P.6	exp	50.4	75.1	0.998	32.8	8.1	12.7	1.2	0.978
	opt	96.4	42.1		96.8	14.3	12.4	4.8	
P.7	exp	3.8	86.7	0.990	99.7	2.5	3.8	-0.2	0.998
	opt	55.2	32.6		15.9	14.1	15.1	3.0	
P.8	exp	15.4	242.0	0.974	5.8	21.9	20.5	-7.8	0.935
	opt	51.2	480.9		42.1	26.3	26.2	-21.0	
P.9	exp	121.8	446.8	0.968	55.6	11.0	0	0.0	0.914
	opt	163.4	240.7		54.1	14.2	66.1	30.7	

586

587

588 **Table 3:** Range of strain determined from CT imaging (ϵ_{CIRC}) and corresponding yield strain
 589 (ϵ_{yield}) extrapolated from stress-strain raw data of biaxial testing.

590

	P.1		P.2		P.3		P.4		P.5		P.6		P.7		P.8		P.9	
	min	max	min	max	min	max	min	max	min	max	min	max	min	max	min	max	min	max
ϵ_{CIRC}	0.01	0.15	0.01	0.03	0.04	0.15	0.03	0.12	0.02	0.18	0.01	0.16	0.01	0.13	0.05	0.10	0.01	0.13
ϵ_{yield}	0.16		0.24		0.25		0.17		0.15		0.09		0.21		0.17		0.08	

591

592

593

594

595 **Table 4:** Mean absolute percentage error (MAPE) of maximum principal stress between
596 experimentally-derived and optimized material parameters.

	P.1	P.2	P.3	P.4	P.5	P.6	P.7	P.8	P.9
Yeoh	0.7105	0.7398	0.7545	0.4520	0.5303	0.7034	0.2138	0.1754	0.3245
Fung	0.7683	0.1140	0.6022	0.3241	0.7539	0.7130	0.0349	0.2198	0.7034

597

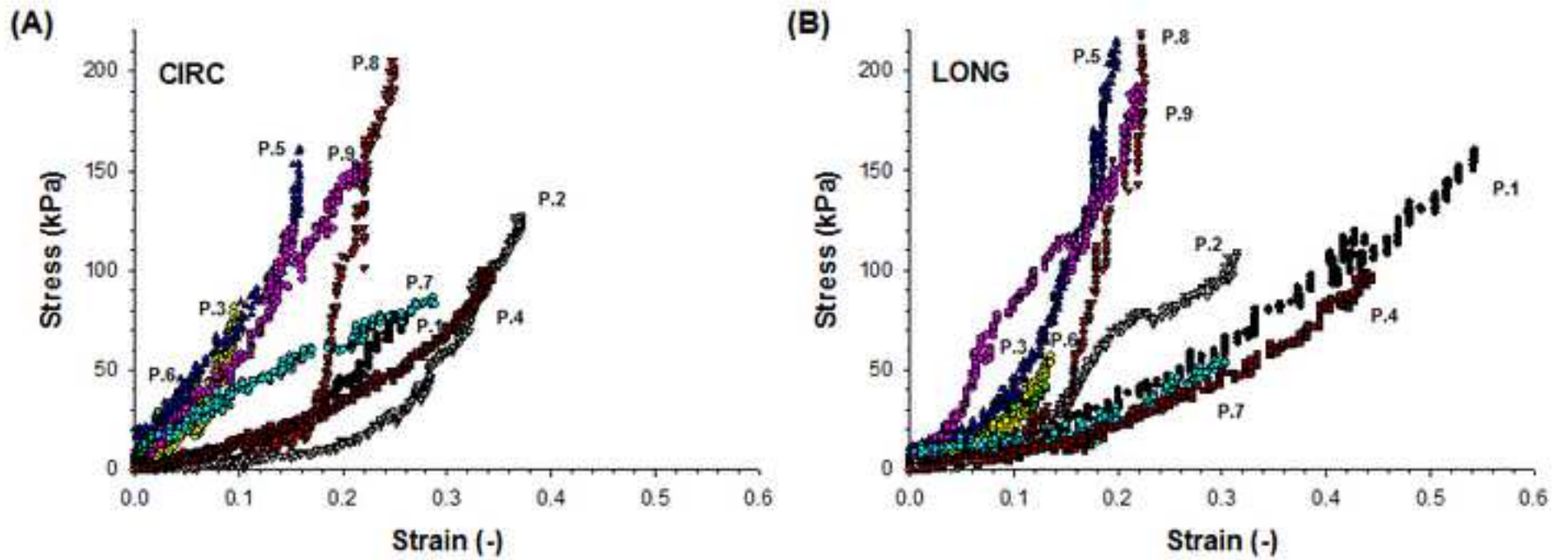
598

599

600

Figure1

[Click here to download high resolution image](#)



P.2

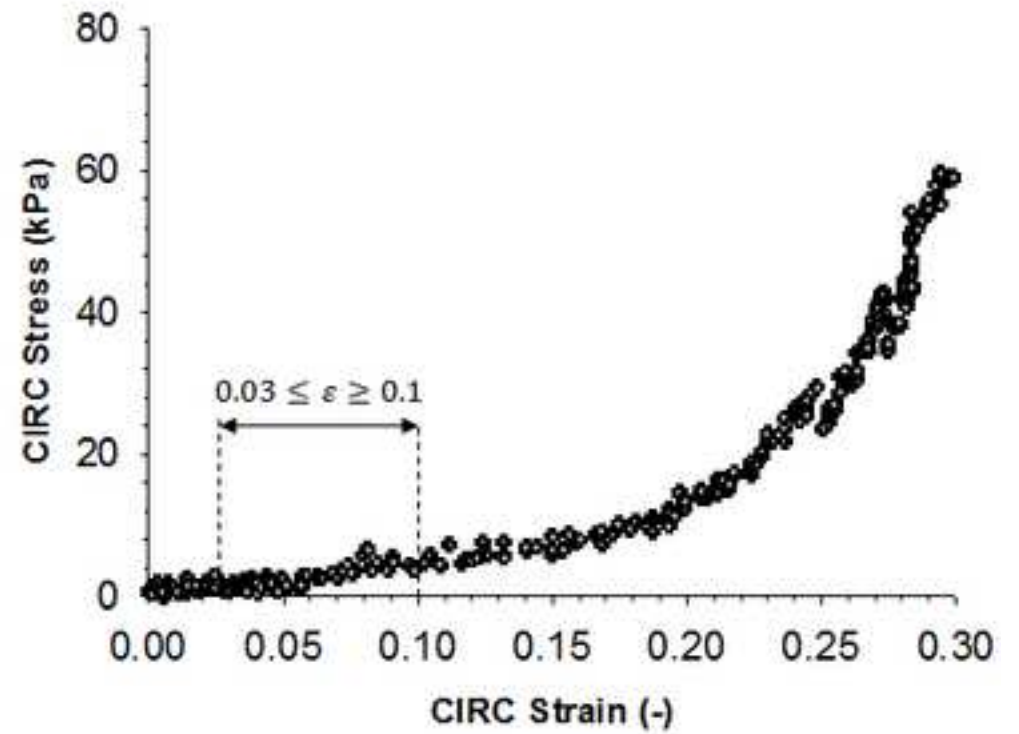
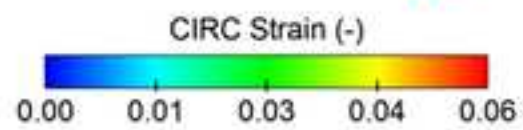
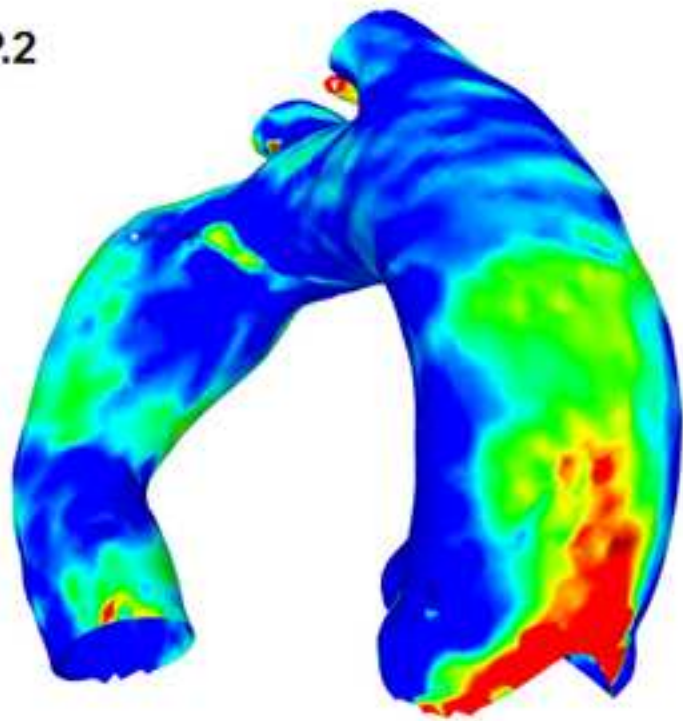
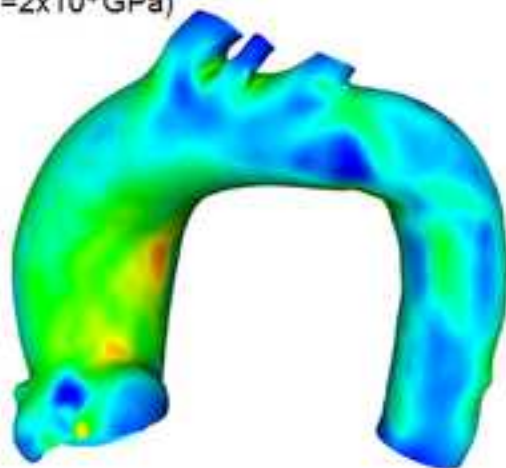


Figure3

[Click here to download high resolution image](#)

“almost-true” stress
($E=2 \times 10^4$ GPa)



Yeoh model
($c_1^Y=21.6$ kPa and $c_2^Y=157.5$ kPa)



Fung model
($c_1^F=27.1$ kPa, $a_1=13.8$, $a_2=8.7$ and $a_3=5.5$)

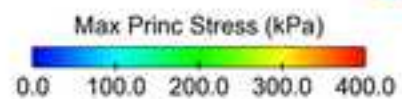
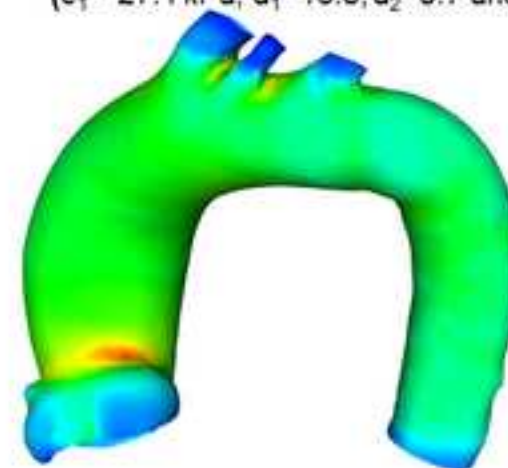


Figure4
[Click here to download high resolution image](#)

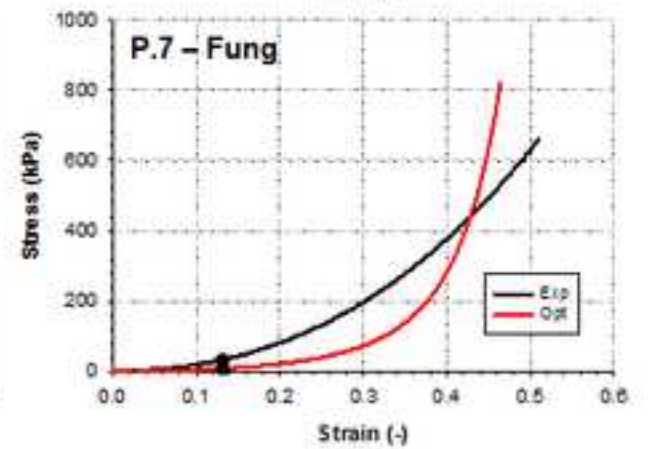
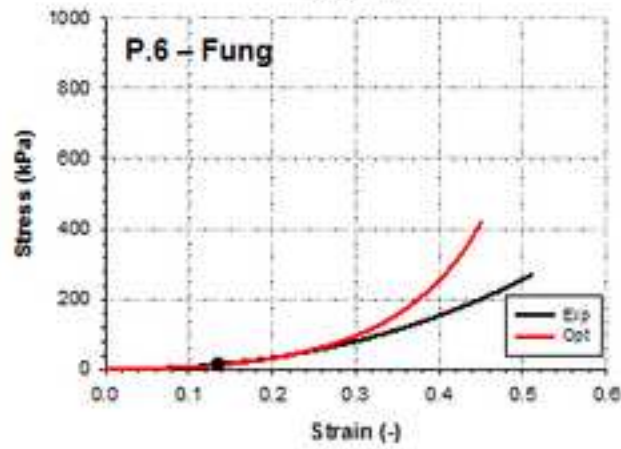
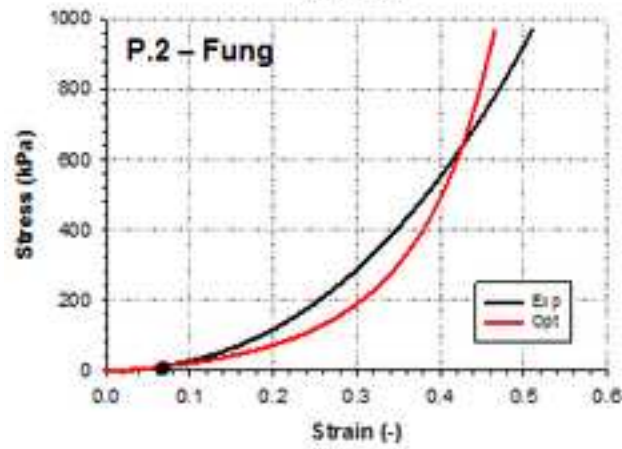
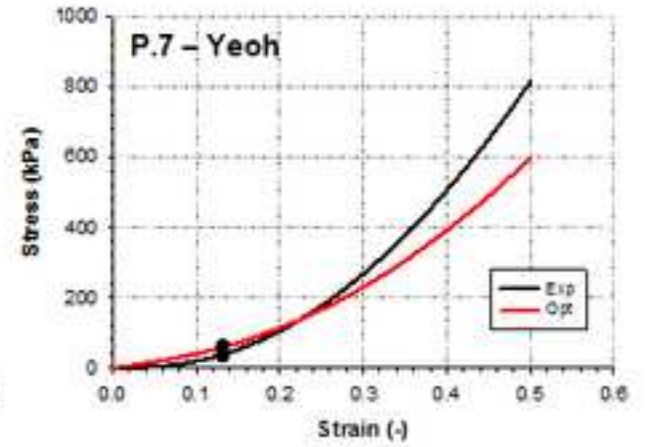
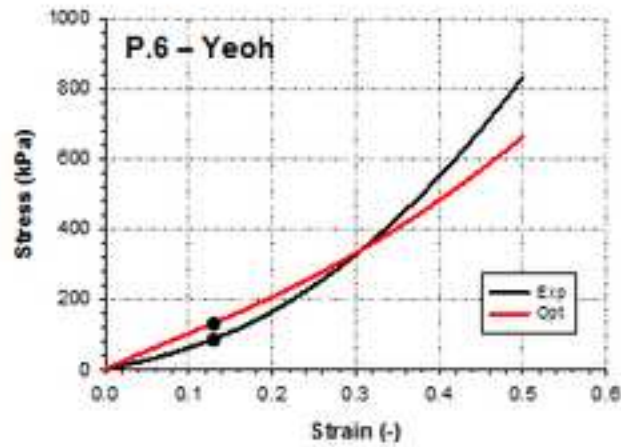
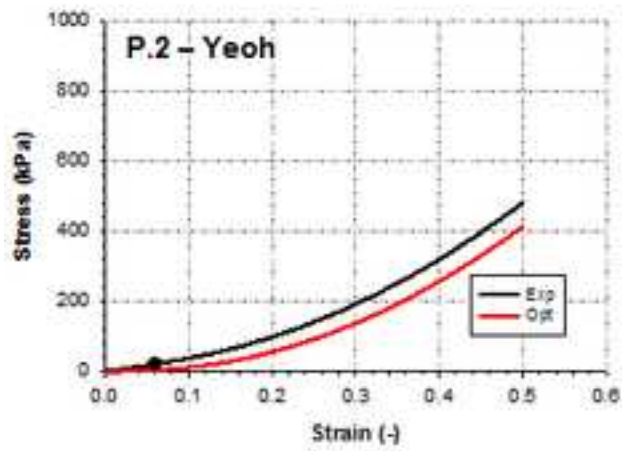
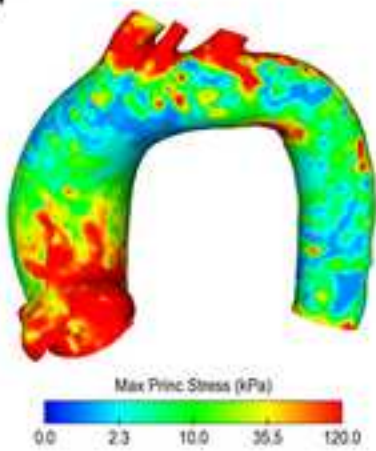
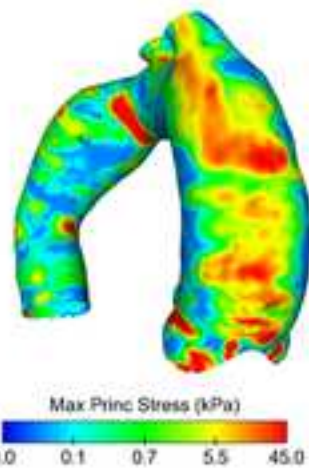


Figure5
[Click here to download high resolution image](#)

P.1



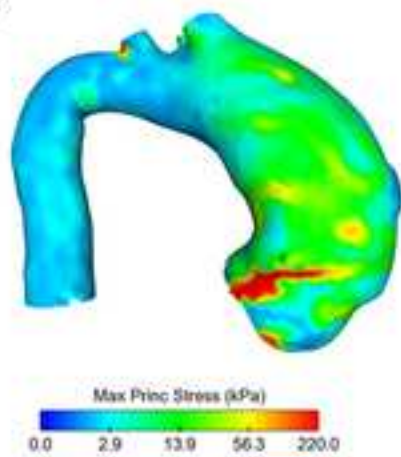
P.2



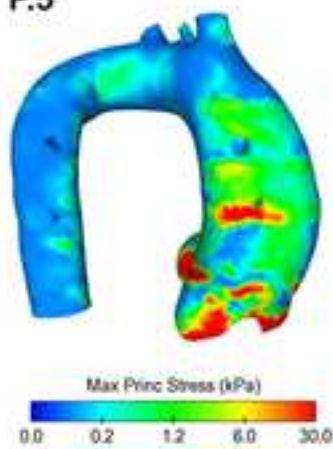
P.3



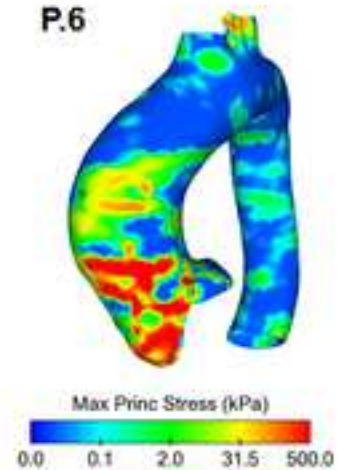
P.4



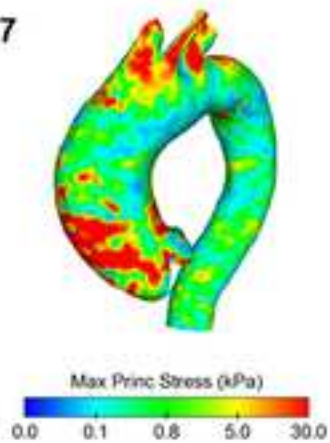
P.5



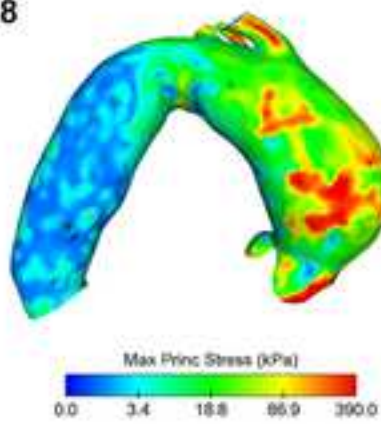
P.6



P.7



P.8



P.9

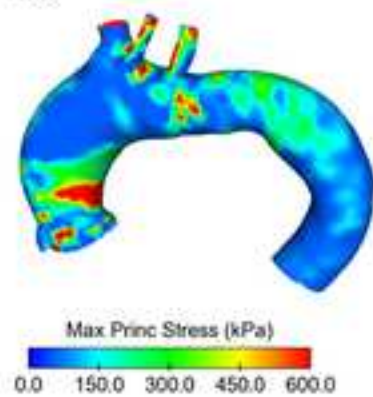
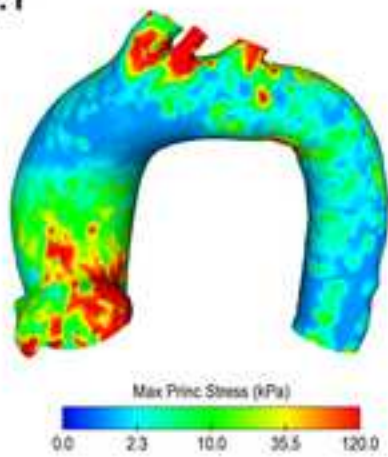
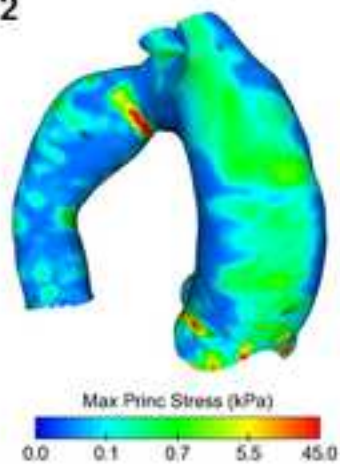


Figure6
[Click here to download high resolution image](#)

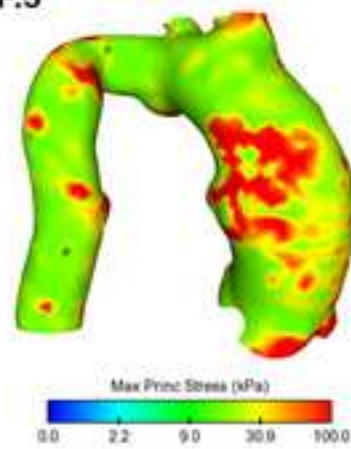
P.1



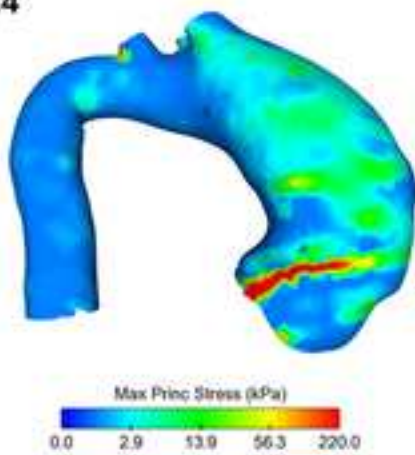
P.2



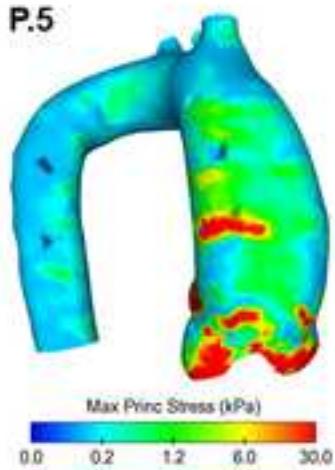
P.3



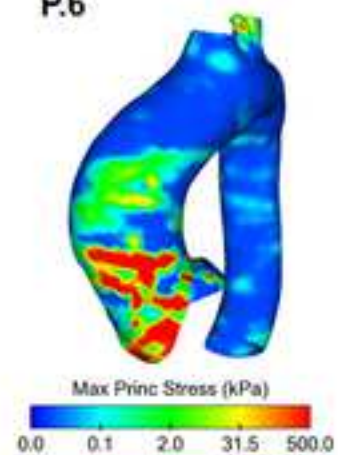
P.4



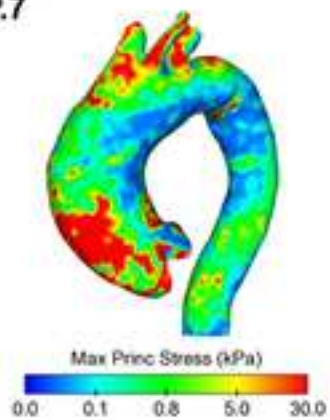
P.5



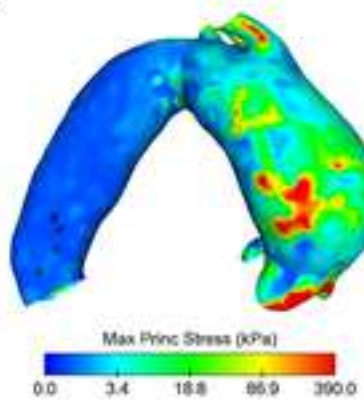
P.6



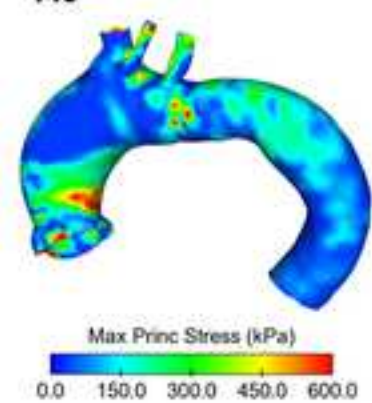
P.7



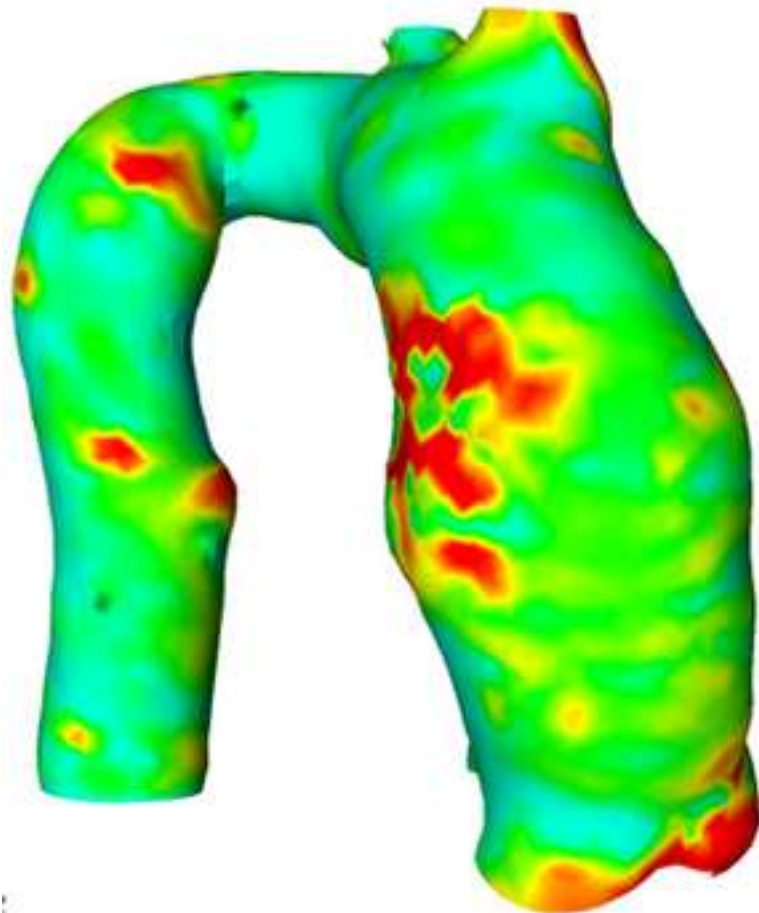
P.8



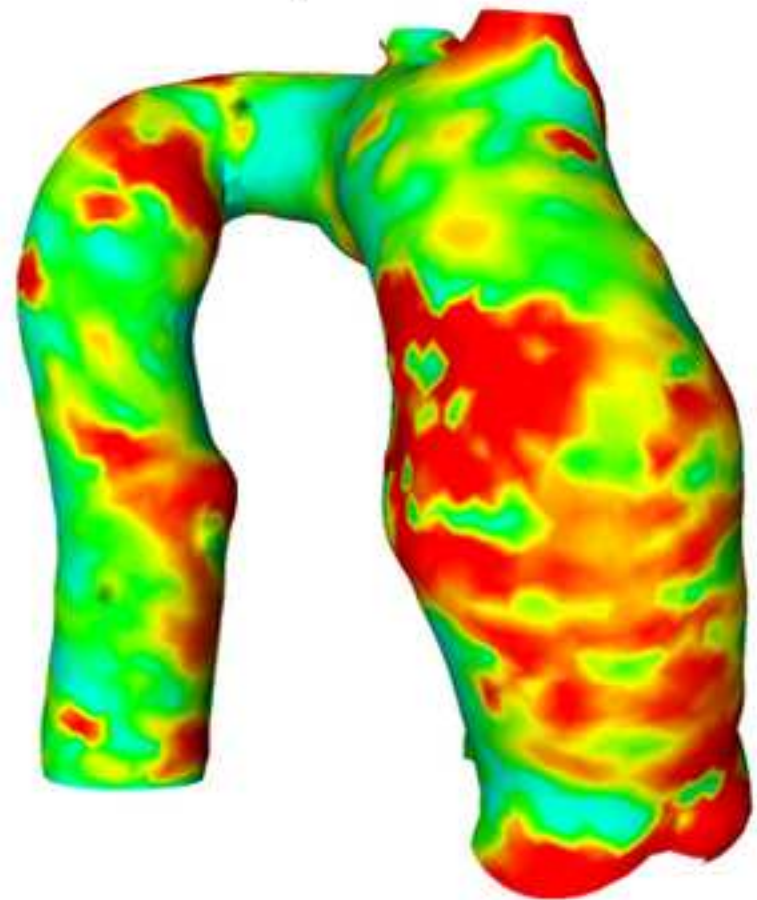
P.9



Elastostatic FEA



Patient-Specific FEA



Max Princ Stress (kPa)

