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Cardiac Remodeling in Aortic and Mitral Valve Disease – a Simulation Study with Clinical Validation

Short title: Cardiac Remodeling in Left-sided Valvular Disease

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Analyzed the data: All authors. Wrote initial draft: EM, MB. Further contributed to the
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1 **Abstract**

2 **Background.** Remodeling is an important long-term determinant of cardiac function
3 throughout the progression of heart disease. Numerous biomolecular pathways for
4 mechanosensing and transduction are involved. However, we hypothesize that biomechanical
5 factors alone can explain changes in myocardial volume and chamber size in valve disease.

6 **Methods.** A validated model of the human vasculature and the four cardiac chambers was used
7 to simulate aortic stenosis, mitral regurgitation and aortic regurgitation. Remodeling was
8 simulated with adaptive feedback preserving myocardial fiber stress and wall shear stress in all
9 four cardiac chambers. Briefly, the model used myocardial fiber stress to determine wall
10 thickness and cardiac chamber wall shear stress to determine chamber volume.

11 **Results.** Aortic stenosis resulted in the development of concentric left ventricular hypertrophy.
12 Aortic and mitral regurgitation resulted in eccentric remodeling and eccentric hypertrophy, with
13 more pronounced hypertrophy for aortic regurgitation. Comparisons with published clinical
14 data showed the same direction and similar magnitudes of changes in end-diastolic volume
15 index and left ventricular diameters. Changes in myocardial wall volume and wall thickness
16 were within a realistic range both in stenotic and regurgitant valvular disease.

17 **Conclusions.** Simulations of remodeling in left-sided valvular disease support, in both a
18 qualitative and quantitative manner, that left ventricular chamber size and hypertrophy are
19 primarily determined by preservation of wall shear stress and myocardial fiber stress.

20
21 *Key words: Cardiac remodeling, Hypertrophy, Valvular disease, Wall shear stress, Myofiber*
22 *stress, Simulations*

23
24 **New & Noteworthy**

25 Cardiovascular simulations with adaptive feedback that normalizes wall shear stress and fiber
26 stress in the cardiac chambers could predict – in a quantitative and qualitative manner –
27 remodeling patterns seen in patients with left-sided valvular disease. This highlights how
28 mechanical stress remains a fundamental aspect of cardiac remodeling. This *in silico* study
29 validated with clinical data paves the way for future patient-specific predictions of remodeling
30 in valvular disease.

31 Introduction

32 The concept of cardiac remodeling was originally coined to describe structural changes in the
33 left ventricle after myocardial infarction, and is currently used in a broader context, referring to
34 the heart's plasticity in general (5, 9, 20). Over the last decades, it has been considered of
35 paramount importance to understand cardiac disease processes that manifest as changes in size,
36 shape, structure and function of the myocardium. The remodeling process has been viewed both
37 as a beneficial, adaptive response that counteracts the negative effects of disease (40) and as
38 detrimental maladaptation causing organ failure and death (9, 12, 23, 49). One of the primary
39 elements in cardiac remodeling is the response to biomechanical stresses (38), although
40 neurohumoral factors, ion channels and cell-cell interactions may also contribute to intracellular
41 signaling cascades that ultimately result in altered myocardial composition and cellular changes
42 (20).

43 The cardiomyocyte has the capability to elongate by adding new sarcomeres in series as well
44 as to increase its radius by adding sarcomeres in parallel as a response to mechanical stress (48).
45 Left ventricular hypertrophy is a primary element of this structural remodeling process, and
46 occurs both due to cellular growth and alterations of the extracellular matrix (9, 12, 40).
47 Advances in cardiac magnetic resonance imaging now allow to measure and distinguish
48 between cellular and matrix volume, and a recent study has shown that most cases of
49 pathological ventricular hypertrophy result from a proportional increase in both cellular and
50 matrix components (46).

51 In order to unravel the nature of the cardiac phenotype, simulations of hemodynamics based on
52 established and validated physical laws are powerful tools to test mechanistic hypotheses within
53 the cardiovascular system. The main driving mechanisms of mechanical adaptation to changing
54 loading conditions need to be identified. So far, it has been postulated, that fiber stress (σ_f) plays
55 an important role in cardiac remodeling and in particular as a determinant of wall thickness
56 (18). Additionally, increased wall shear stress (σ_{wss}) has been suggested to cause vessel dilation
57 in vascular remodeling (24, 36, 50), and we propose that it has a comparable effect in cardiac
58 remodeling, where volume loading (increasing σ_{wss}) is known to cause dilatation in a way
59 similar to vessel dilatation in response to increasing flow (26, 43). σ_{wss} can be described as the
60 tangential frictional force between blood flow and the endothelium/endocardium. Based on
61 these considerations, we hypothesize that preserving mean σ_f and mean σ_{wss} are the major
62 biomechanical drivers of cardiac remodeling. Specifically, we assume σ_{wss} to be the major
63 determinant of chamber size and σ_f the major factor responsible for changes in wall thickness

64 and myocardial volume. The aim of this study was to assess the validity of these hypotheses by
65 comparing computer simulations with clinical imaging data in the three most common valve
66 diseases (11, 28), i.e. in aortic stenosis, mitral regurgitation and aortic regurgitation, where early
67 detection and appropriate timing of surgical intervention are of great clinical importance (21,
68 28).

69 **Methods**

70 A closed-loop real-time cardiovascular simulation model of the cardiovascular system
71 previously developed and validated was used as simulation platform for this study (7, 8, 13).
72 The model was expanded to include real-time calculations of σ_f and σ_{wss} to allow the
73 implementation of adaptive remodeling rules.

74

75 **Modeling assumptions**

76 The following sections explain the geometrical assumptions made for the four cardiac chambers
77 and the two adaptation rules implemented to simulate the cardiac remodeling process.

78

79 **Chambers' geometry**

80 Cardiac chambers' geometry was approximated with simple geometric shapes. The atria were
81 both considered as spheres, the left ventricle as a half ellipsoid and the right ventricle as a
82 quarter of an ellipsoid (Figure 1). Throughout the text, all parameters and variables that change
83 with time are indicated with lower-case letters, whereas constant parameters are indicated with
84 upper-case letters. All chambers were characterized by an inner radius r and a wall thickness h .
85 The length of the ventricular ellipsoidal shapes was set to $3r$, based on clinical data (45). No
86 interatrial nor interventricular septal interactions were taken into account. Based on these
87 assumptions, wall and chamber volumes were calculated as follows. Equations (1) and (2)
88 represent the atrial cavity volume and the atrial myocardial wall volume, respectively.
89 Similarly, equation (3) and (4) represent the left ventricular (LV) cavity volume and the LV
90 myocardial wall volume. The volume of the right ventricular (RV) cavity and RV wall volume
91 are calculated as half of equation (3) and (4).

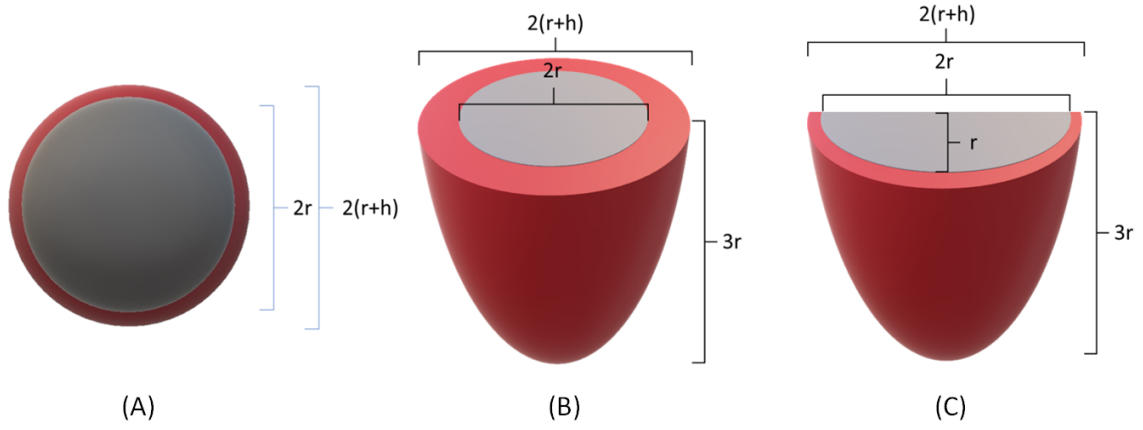


Figure 1. (A) Atria. Both the left and right atrium are approximated to be spheres with an inner radius of r , a wall thickness of h , an inner blood volume of v and a wall volume of v_{wall} . (B) Left ventricle. The left ventricle is approximated to be a half ellipsoid with max inner radius r , wall thickness h and a length of $3r$. (C) Right ventricle. The right ventricle is approximated to be a quarter ellipsoid with max inner radius r , wall thickness h and a length of $3r$.

$$v = \frac{4 \cdot \pi \cdot r^3}{3} \quad (1)$$

$$v_{wall} = \frac{4 \cdot \pi \cdot (r+h)^3}{3} - \frac{4 \cdot \pi \cdot r^3}{3} \quad (2)$$

$$v = \frac{1}{2} \cdot \frac{4 \cdot \pi \cdot 3r \cdot r^2}{3} = 2 \cdot \pi \cdot r^3 \quad (3)$$

$$v_{wall} = \frac{1}{2} \cdot \frac{4 \cdot \pi \cdot (3r+h) \cdot (r+h)^2}{3} - 2 \cdot \pi \cdot r^3 \quad (4)$$

92 **Myofiber stress and wall shear stress definition**

93 Instantaneous σ_f was calculated as indicated in equation 5, based on previous work by Arts et
94 al (1). Myocardial σ_{wss} was calculated assuming a laminar flow through a tube with the same
95 diameter as the largest chamber diameter (equation 6), analogous to vascular tissue remodeling
96 (35). Chamber flow $q_{chamber}$ was calculated as the mean value of absolute inlet and outlet flows
97 at each time step in the simulation, as shown in equation 7. In such a way, σ_{wss} is affected by
98 both antegrade and retrograde flow. If no regurgitant valve flows or shunts are present, then
99 mean $q_{chamber}$ equals cardiac output. In regurgitant valve disease, $q_{chamber}$ becomes considerably
100 larger than cardiac output because the absolute value of both forward and backward flows are
101 taken into account.

102

$$\sigma_f = p \cdot \frac{3}{\ln \left(1 + \frac{v_{wall}}{v_{lumen}} \right)} \quad (5)$$

(6)

$$\sigma_{wss} = \frac{4 \cdot \eta \cdot q_{chamber}}{\pi \cdot r^3}$$

$$q_{chamber} = \frac{|q_{inlet}| + |q_{outlet}|}{2} \quad (7)$$

103 Variables and constants. σ_f = chamber myofiber stress, p = chamber intracavitary pressure, \ln =
104 natural logarithm operator, v_{wall} = chamber wall volume, v_{lumen} = chamber intracavitary blood
105 volume, σ_{wss} = chamber wall shear stress, η = blood viscosity, $q_{chamber}$ = chamber blood flow,
106 r = chamber radius, q_{inlet} = inlet valve blood flow, q_{outlet} = outlet valve blood flow.

107

108 **Myocardial volume adaptation**

109 The first remodeling rule determines the adaption of myocardial wall volume by preservation
110 of σ_f . Total myocardial volume was assumed to be 160 mL based on a generic adult person of
111 70 kg and 170 cm length with a body surface area of 1.81 m². We assumed that the myocardium
112 was distributed among the four cardiac chambers in proportion to the sum of the passive
113 stiffness constant and the systolic contractility (see Appendix for further details). Then,

114 remodeling rules were activated, and parameters reached the values presented in Table 1. This
 115 set of parameters was the starting point of the valve disease simulations.

116

117 Table 1. Start values representing normal physiology at mean wall shear stress 0.0025 mmHg
 118 and mean myofiber stress 120 mmHg in all chambers. Gray columns show baseline elastance
 119 values and white columns chamber dimensions derived from elastance values using the
 120 geometric assumptions and remodeling algorithms described in the main text.

| | Passive stiffness constant | Systolic contractility | Sum | Wall volume | Chamber diameter | Wall thickness |
|--------------|----------------------------|------------------------|----------------|-------------|------------------|----------------|
| | <i>mmHg/mL</i> | <i>mmHg/mL</i> | <i>mmHg/mL</i> | <i>mL</i> | <i>mm</i> | <i>mm</i> |
| RA | 0.097 | 0.065 | 0.162 | 6 | 48* | 0.9* |
| RV | 0.012 | 0.599 | 0.611 | 24 | 68/50** | 2.7/4.5** |
| LA | 0.144 | 0.103 | 0.247 | 10 | 47* | 1.3* |
| LV | 0.021 | 2.735 | 2.753 | 108 | 54/39** | 8.2/12.8** |
| TOTAL | 0.274 | 3.502 | 3.776 | 148 | | |

121 RA = right atrium, RV = right ventricle, LA = left atrium, LV= Left ventricle.
 122 *mean value, **end-diastolic/end-systolic.

123

124 The target σ_f was set to 120 mmHg in each cardiac chamber. This value was chosen as it
 125 provided physiological arterial pressure and cardiac output. The wall volume was assumed
 126 proportional to the total elastance and adjusted until the target σ_f was reached. The total
 127 myocardial volume was updated accordingly. Both stiffness constant and contractility were
 128 changed proportionally (see appendix for definitions and further details). This means that an
 129 increase in contractility was assumed to be accompanied by an increase in passive stiffness as
 130 is seen in many patients with clinical LV hypertrophy due to structural valve disease or
 131 hypertension (30, 42, 51).

132

133 Chamber volume adaptation

134 The second remodeling rule determines the adaption of chamber volume in order to preserve
 135 σ_{wss} , with a target value of 0.0025 mmHg (see Appendix for target value selection criteria and
 136 sensitivity). The adaptation operates as follows: σ_{wss} is continuously calculated during
 137 simulations as in equation 2. Then, the volume intercept V_0 of the elastance function of each

138 chamber is adjusted until a target σ_{wss} value of 0.0025 mmHg is reached. A change in V_0 can
139 be interpreted as a change in the unstressed chamber volume by adding/removing or
140 elongating/shortening sarcomeres in series within the cardiomyocyte.

141 The two rules act simultaneously and myocardial σ_f and σ_{wss} interact mutually because (i) they
142 are both affected by changes in chamber size and (ii) the wall volume and the chamber volume
143 are both determinants of stress. In general, dilatation of a chamber will lead to an increase in σ_f ,
144 which in turn requires an increase in wall volume and wall thickness to preserve σ_f .

145

146 **Simulation of valvular disease**

147 Aortic stenosis was simulated by incrementally decreasing the open aortic valve area from 5.0
148 cm² to 0.5 cm² in steps of 1.00 cm² for the mild range and steps of 0.25 cm² for the severe
149 range. Mitral regurgitation was simulated by increasing the closed mitral valve area from 0.0
150 cm² to 0.80 cm² in steps of 0.10 cm², corresponding to regurgitant fractions from 0% to 54%.
151 Aortic regurgitation was simulated by increasing the closed aortic valve area from 0.0 cm² to
152 0.45 cm² in steps of 0.05 cm², corresponding to a regurgitant fraction increase from 0% to 61%.
153 Heart rate, vascular properties and blood volume were kept unchanged. Consequently, no
154 autoregulatory or compensatory mechanisms were included in the simulations, other than
155 cardiac remodeling. The pericardium was allowed to remodel in size (41) to create a mean
156 pericardial pressure of 0 mmHg – therefore the pericardium did not constrain the heart. Notably,
157 vascular properties were kept unchanged in the simulation study. In this way, possible
158 confounding factors were limited, increasing the correlation between the regurgitant/stenotic
159 valve area and degree of remodeling.

160 Additionally, the independent effect of σ_{wss} and σ_f adaptation was tested by simulating various
161 degrees of aortic regurgitation while preserving only one variable at the time. First, σ_{wss}
162 adaptation was allowed, but not σ_f , and then vice versa.

163

164 **Calculations**

165 Simulations were run using the software Aplysia CardioVascular Lab 7.0.4.11 (Aplysia
166 Medical AB, Stockholm, Sweden). Mean values in the model were calculated as a weighted
167 running average with recent values having more impact than older ones (see appendix for
168 details). Intrathoracic pressure changes due to respiration were omitted in the simulations.
169 Hemodynamic differential equations were solved with implicit or explicit Euler's method,
170 while wall thickness 3rd degree polynomial equations were solved with Newton-Raphson's

171 method. Pressures, flows, volumes and saturations in every compartment were calculated with
172 a frequency of 4000 Hz. Calculations and adaptation of σ_f and σ_{wss} algorithms were
173 implemented in the software and run automatically, reaching stable steady-state values within
174 5 minutes. This implies that acute hemodynamics were simulated in real-time, but remodeling
175 was simulated in a time-scale at least 10,000 times faster than in real physiology (50,000
176 minutes corresponding to 35 days). All data were collected at end-diastole when simulations
177 had reached a steady-state regarding remodeling, hemodynamics and oxygen transport.

178

179 Comparison with clinical data

180 Simulation results were compared with published clinical data on LV mass and volume for
181 aortic stenosis (14) and mitral and aortic regurgitation (47). Specifically, the data were extracted
182 from Uretsky et al. (47) by calculating the desired variable y using the regression equation
183 reported in the reference, with x equal to the simulated regurgitant flow. Simulation outputs
184 were then compared with patients' values in a quantitative manner by looking at the slope and
185 offset of the linear regression lines. When such data were not available in the reference studies
186 (14, 47), a qualitative comparison of remodeling patterns in simulations and patients was
187 performed. The different LV remodeling patterns were classified as follows (i) concentric
188 remodeling: LV diameter preserved or reduced with wall volume increase below clinical
189 detection limit of current imaging techniques; (ii) concentric hypertrophy: LV diameter
190 preserved or reduced with increase in wall volume; (iii) eccentric remodeling: LV diameter
191 increased in size with wall volume increase below clinical detection limit; (iv) eccentric
192 hypertrophy: LV diameter increased with increase in wall volume.

193 Results

194 Simulation output for the three different valvular diseases are shown in Figure 2 and are
195 described in the following sections including a quantitative comparison with published clinical
196 data. Figure 2 shows a summary of the simulation for the three valvular diseases investigated.
197 The regurgitant/stenotic valve area is reported as a label at each simulated step. Aortic stenosis
198 showed a concentric remodeling pattern (decrease in LV end-diastolic volume) accompanied
199 by large increase in LV wall volume, especially for the most severe cases. On the contrary,
200 aortic and mitral regurgitation show an eccentric remodeling pattern with increased LV end-
201 diastolic volume. Aortic regurgitation showed a more pronounced hypertrophy (increase in LV
202 wall volume) than mitral regurgitation. Additional hemodynamic outputs are presented in Table
203 2.

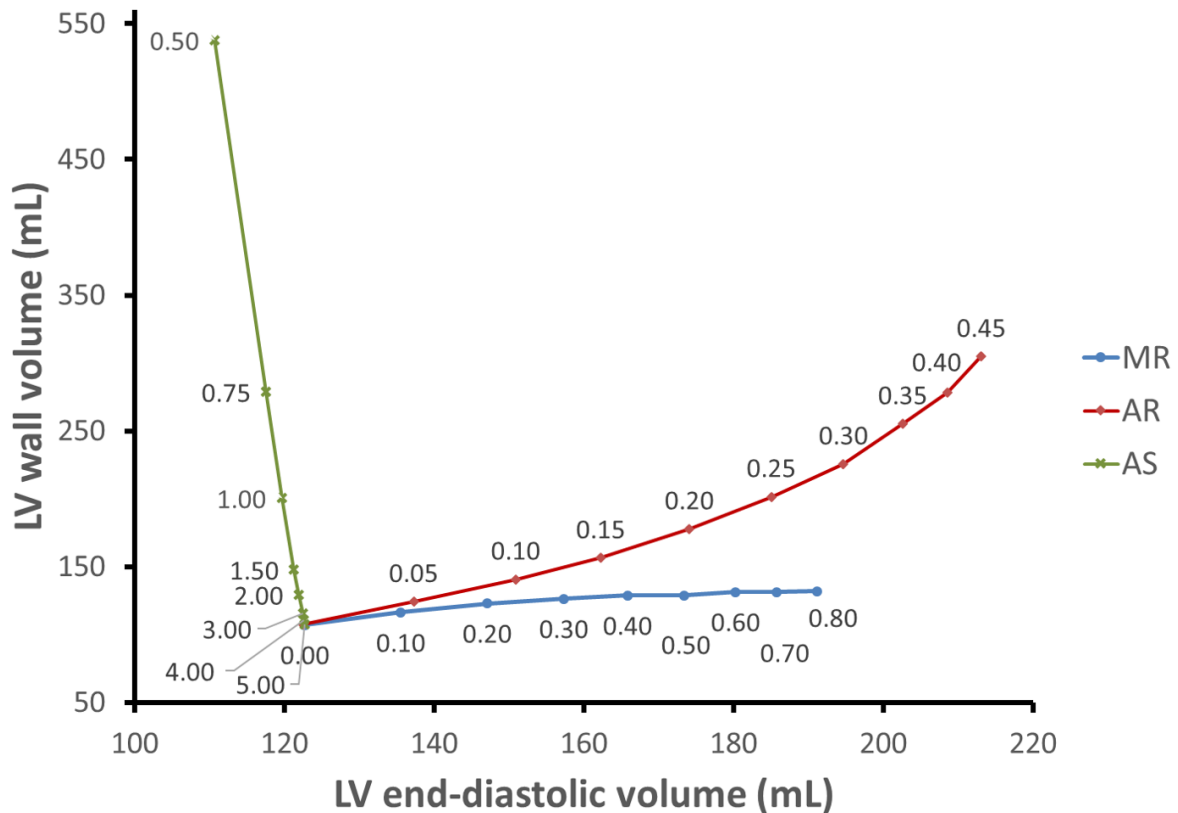


Figure 2. Simulation output of changes in left ventricular end-diastolic volumes and wall volumes in valvular disease with varying valve areas. Aortic stenosis (AS), mitral regurgitation (MR) and aortic regurgitation (AR). Valve areas for each simulation step are indicated in the figure. AS result in concentric hypertrophy and AR and MR in eccentric hypertrophy (more pronounced hypertrophy in AR).

204

205 Aortic stenosis

206 Simulations of aortic stenosis with adaptive remodeling showed that systolic arterial pressure
 207 and cardiac output at rest were preserved until the aortic valve area reached approximately
 208 1.5 cm². For smaller areas, systolic pressure dropped from 118 mmHg to 105 mmHg in the
 209 most severe case, with a maximum aortic valve area of 0.5 cm², and cardiac output changing
 210 from 5.7 L/min to 5.1 L/min. Diastolic arterial pressure was essentially preserved. Resulting
 211 LV geometries are shown in Figure 3. The LV hypertrophied for aortic areas below 1.5 cm².
 212 LV diastolic wall thickness increased from 10.7 mm to 28.0 mm when the aortic valve area
 213 decreased between 1.5 cm² and 0.5 cm². At the same time, the LV preserved its diameter until
 214 valve areas fell below 1.0 cm² and slightly decreased in the most severe case. The LA preserved
 215 its size. The results suggest that a normal LV internal diameter is preserved down to an aortic

216 valve area of approximately 2 cm². For more severe stenosis, the LV showed a concentric
 217 remodeling pattern down to a valve area of 1.5 cm². For the most severe stenosis areas, the LV
 218 geometry can be classified as concentric hypertrophy. Simulation output are in agreement with
 219 data from patients with aortic stenosis (18), although patients in the study by Dweck *et al.* (14)
 220 exhibited different LV remodeling patterns: normal LV, concentric remodeling and concentric
 221 hypertrophy, both symmetric and asymmetric.

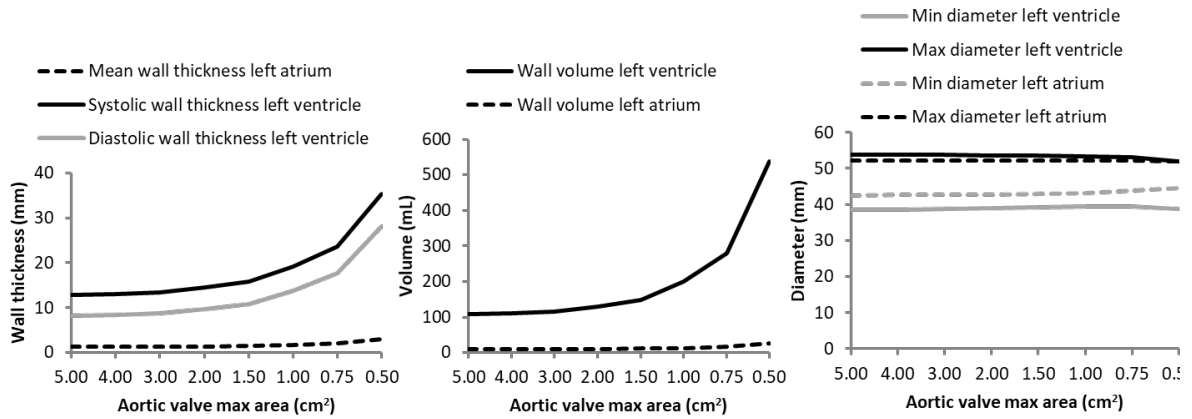


Figure 3. Simulation output of different degrees of severity of aortic stenosis with myocardial remodeling. A small aortic opening area results in a large increase in systolic and diastolic wall thickness, left ventricular wall volume and a slight decrease in chamber diameter.

222

223

224 **Mitral regurgitation**

225 Simulations of mitral regurgitation with adaptive remodeling showed that systemic arterial
226 blood pressure decreased from 122/76 (systolic/diastolic) mmHg with no regurgitant volume to
227 100/63 mmHg in the most severe case, with a minimum mitral valve area 0.8 cm², regurgitant
228 volume of 67 mL corresponding to a regurgitant fraction of 54%. Cardiac output decreased
229 from 5.7 L/min to 4.1 L/min. Resulting LV geometries are shown in Figure 4. LV diastolic wall
230 thickness decreased from 8.2 mm to 7.8 mm, whereas total LV wall volume increased from 107
231 mL to 132 mL. The LV enlarged by increasing its diastolic diameter from 54 mm to 62 mm.
232 The LA also increased its diameter to a similar degree. The results represent a LV eccentric
233 remodeling pattern.

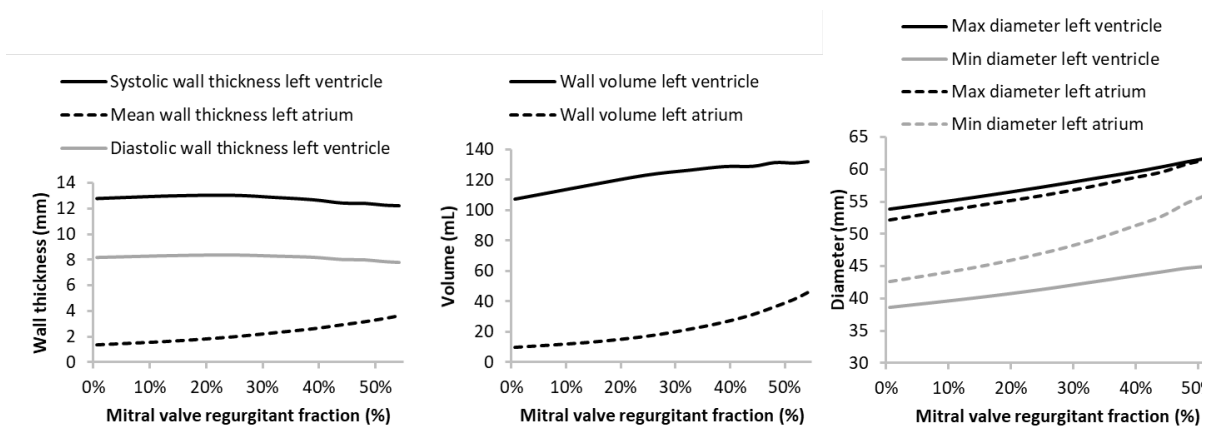


Figure 4. Simulation output of different degrees of severity of mitral regurgitation with myocardial remodeling.

234

235 When comparing simulation results with clinical data (Figure 5), it can be seen that they follow
236 the same direction of changes for LV end-diastolic volume index (EDVI), end-systolic volume
237 index (ESVI), LV end-systolic diameter (ESD) and LA volume. Also, slopes and offset agreed
238 well in magnitude with clinical data, as shown by the linear regression equations in Figure 5.

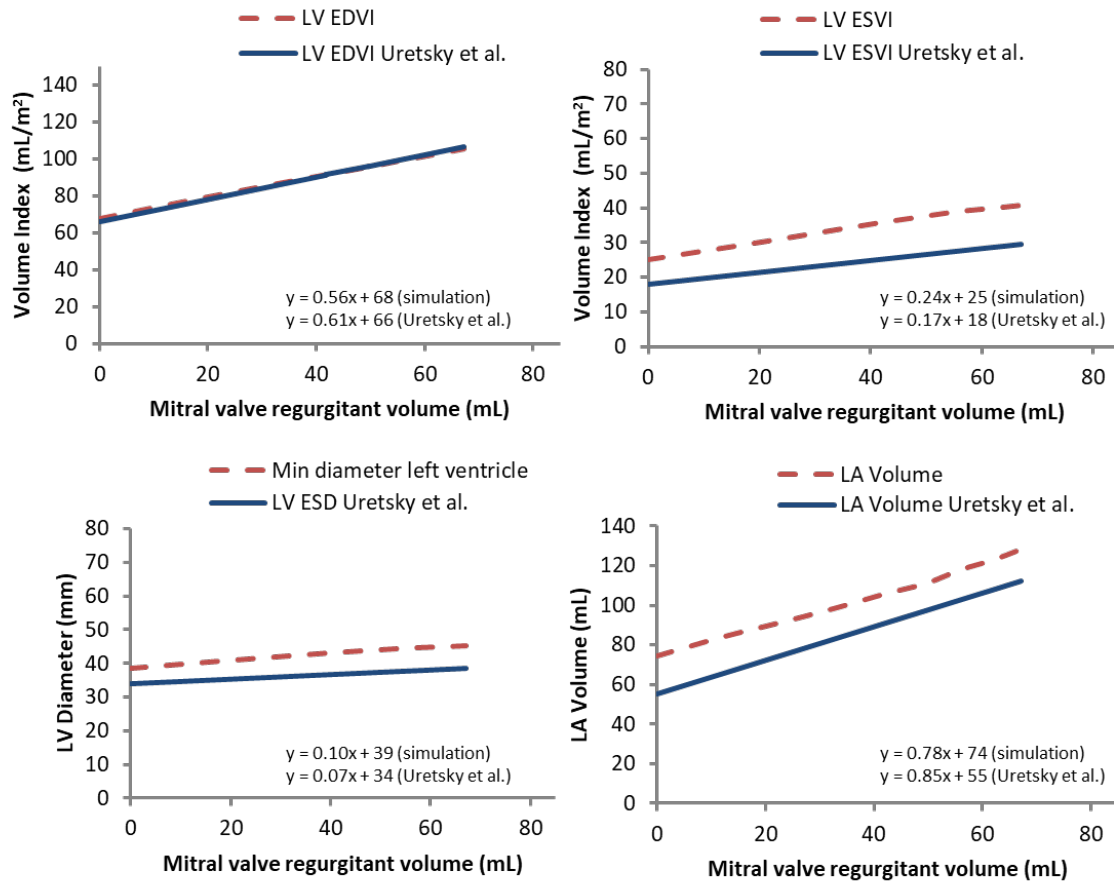


Figure 5. Comparison between simulation output in mitral regurgitation and clinical data from Uretsky et al. (47). The linear regression equations are shown in the lower part of each panel.

239

240 Aortic regurgitation

241 Simulations of aortic regurgitation with adaptive remodeling showed that systolic arterial
 242 pressure was preserved from the normal initial case to the most severe case, with a regurgitant
 243 aortic valve area of 0.45 cm^2 , regurgitant volume of 83 mL, and regurgitant fraction of 61%.
 244 Diastolic arterial pressure decreased from 76 mmHg to 44 mmHg between the same two
 245 scenarios. Cardiac output decreased from 5.7 L/min to 4.0 L/min. Resulting LV geometries are
 246 shown in the upper row of Figure 6. LV diastolic wall thickness increased from 8.2 mm to 14.7
 247 mm. The LV hypertrophied and enlarged by increasing its wall volume from 108 mL to 305
 248 mL and its diastolic diameter from 54 mm to 65 mm. The LA did not enlarge but became
 249 slightly smaller in the most severe cases. The results represent a LV eccentric remodeling
 250 pattern with hypertrophy.

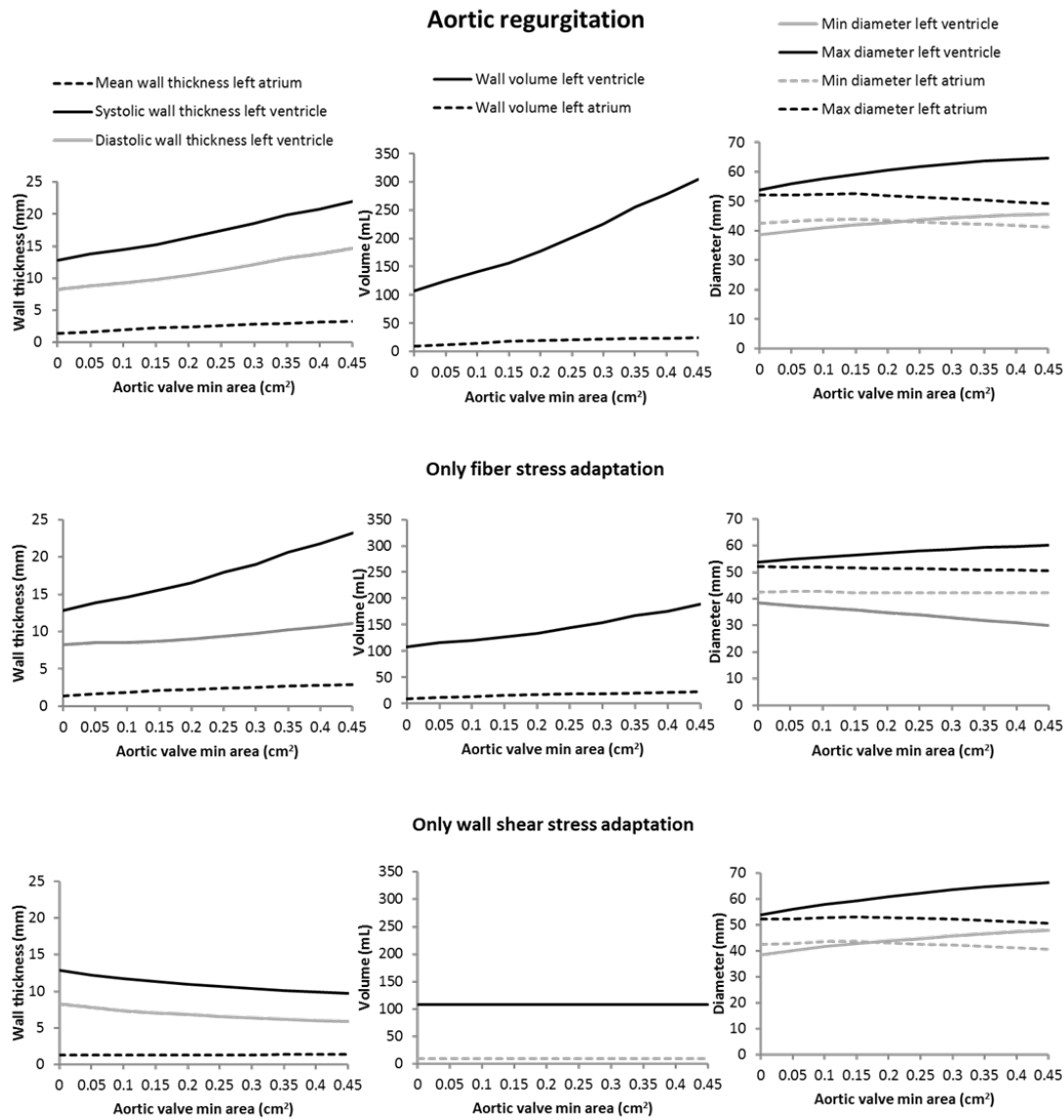


Figure 6. Simulation output of different degrees of severity of aortic regurgitation with complete myocardial remodeling based on both fiber stress and wall shear stress in the upper row. The middle row shows adaptation of fiber stress excluding adaptation of wall shear stress and the bottom row adaptation of wall shear stress excluding adaptation of fiber stress. Wall shear stress induced dilatation and wall thinning occurs in the bottom row, while wall volume increase with wall thickening occurs in the middle row with only fiber stress adaptation. Both mechanisms are needed for a realistic adaptive remodeling process as seen in the upper row.

251

252 When comparing simulation results with clinical data (Figure 7) for LV EDVI, ESVI, LV ESD
 253 and LV end-diastolic diameter (EDD), all four variables agreed in terms of direction of changes.

254 Also, LV diastolic and systolic diameters agreed very well in magnitude compared to clinical

255 data, whereas LV EDVI and LV ESVI increased less in simulations than in the clinical data as
 256 can be seen in the lower slopes of the simulation regression lines in Figure 7.

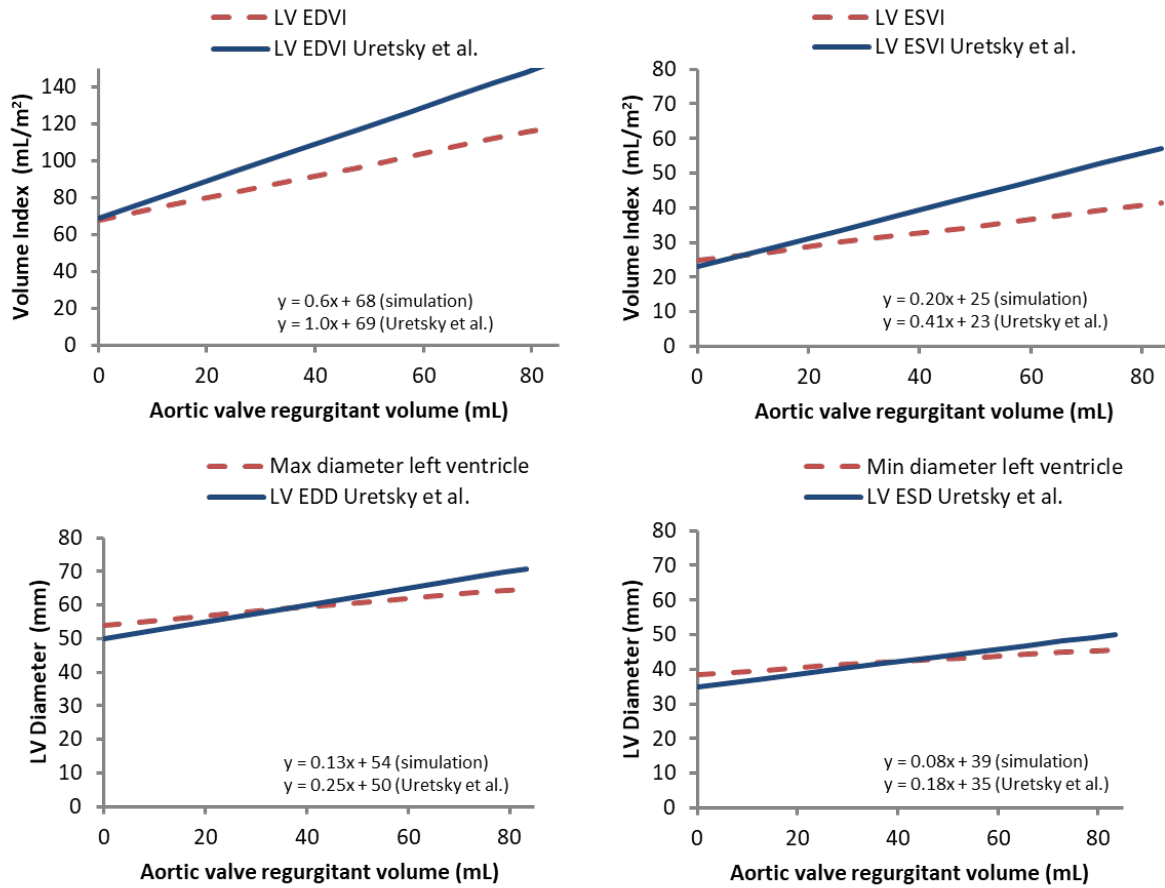


Figure 7. Comparison between simulation output in aortic regurgitation and clinical data from Uretsky et al. (47). The linear regression equations are shown in the lower part of each panel.

257

258

259 Isolated effect of wall shear and fiber stress adaptation in aortic regurgitation

260 The middle and lower rows of Figure 6 show the output of the simulations when the two
 261 adaptation rules were activated separately. σ_f adaptation alone resulted in an increasing wall
 262 volume. The small changes seen in LV size is caused by the regurgitation contributing to filling
 263 combined with the increased contractility and stiffness associated with increased wall volume.
 264 On the contrary, σ_{wss} adaptation alone caused the LV to remodel in an eccentric manner (both
 265 minimum and maximum diameter increased with increasing regurgitant volume), whereas wall
 266 volume remained constant. Notably, despite wall volume not changing, wall thickness
 267 decreased as a consequence of LV enlargement. The combined effect of the two adaptation

268 rules in aortic regurgitation are shown in the upper row of Figure 6 and illustrates the
 269 interaction, where σ_{wss} induced dilatation results in higher σ_f and therefore a need for a more
 270 pronounced wall volume increase to preserve fiber stress.

271 Table 2. – Main hemodynamic variables (simulation output) for the normal case and three
 272 different degrees of severity of valve diseases.

| Area | Systolic arterial pressure | Diastolic arterial pressure | Mean arterial pressure | Cardiac output | LV Ejection fraction | RV Ejection fraction | LA pressure | RA pressure |
|-----------------------------|----------------------------|-----------------------------|------------------------|----------------|----------------------|----------------------|-------------|-------------|
| <i>cm²</i> | <i>mmHg</i> | <i>mmHg</i> | <i>mmHg</i> | <i>L/min</i> | - | - | <i>mmHg</i> | <i>mmHg</i> |
| Baseline | | | | | | | | |
| 0/5.00 | 122 | 76 | 95 | 5.73 | 0.65 | 0.65 | 6.9 | 4.3 |
| Mitral regurgitation | | | | | | | | |
| 0.3 | 113 | 70 | 86 | 4.99 | 0.65 | 0.65 | 9.9 | 4.0 |
| 0.6 | 104 | 65 | 78 | 4.39 | 0.65 | 0.65 | 12.4 | 3.7 |
| 0.8 | 100 | 63 | 74 | 4.11 | 0.65 | 0.65 | 13.7 | 3.6 |
| Aortic regurgitation | | | | | | | | |
| 0.2 | 123 | 60 | 83 | 4.82 | 0.64 | 0.65 | 10.7 | 4.1 |
| 0.3 | 129 | 50 | 77 | 4.37 | 0.65 | 0.65 | 13.3 | 3.9 |
| 0.5 | 131 | 44 | 71 | 3.95 | 0.65 | 0.65 | 16.0 | 3.9 |
| Aortic stenosis | | | | | | | | |
| 3.00 | 121.45 | 76.52 | 94.67 | 5.72 | 0.65 | 0.65 | 6.8 | 4.3 |
| 1.00 | 115.51 | 76.11 | 93.22 | 5.59 | 0.65 | 0.65 | 8.4 | 4.2 |
| 0.50 | 105.24 | 72.49 | 87.24 | 5.11 | 0.65 | 0.65 | 13.8 | 3.9 |

273

274

275 Discussion

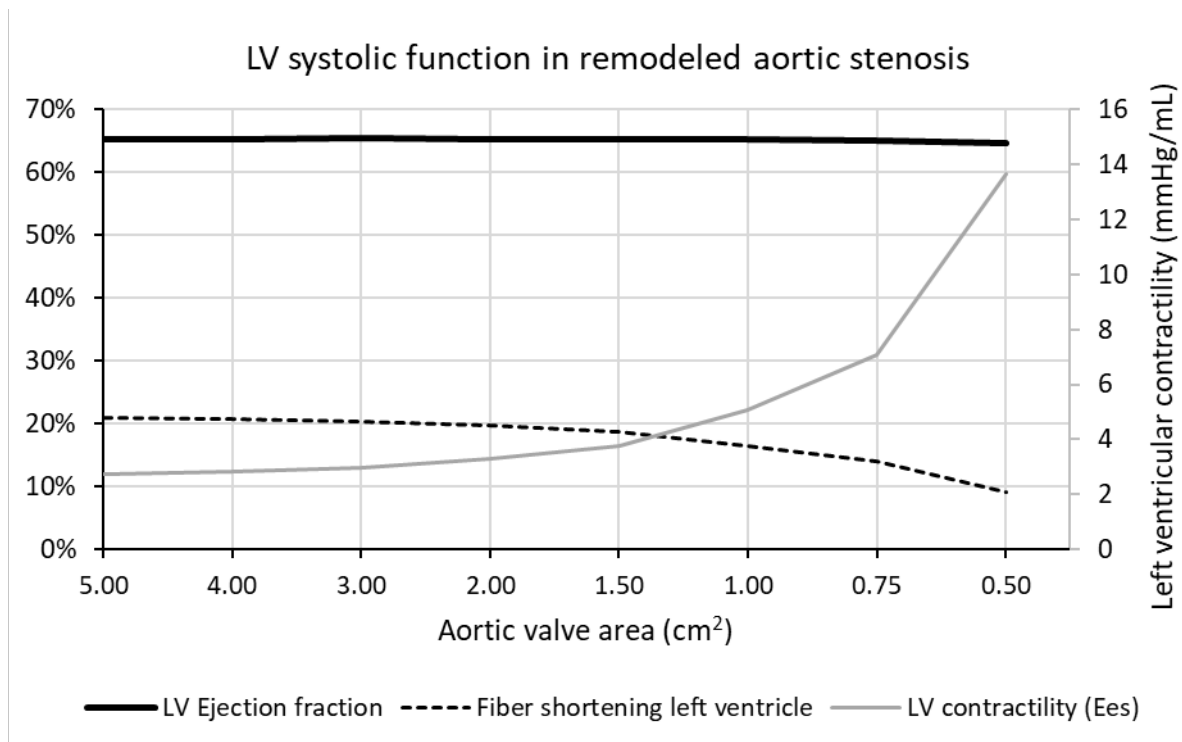
276 The major finding of this study is that our cardiovascular simulation of cardiac remodeling in
277 valvular disease based purely on mechanical factors accurately predicts typical remodeling
278 patterns seen in patients. The heart changes its size in conjunction with its myocardial volume
279 in order to preserve a target σ_{wss} and σ_f and the resulting geometry is validated against high-
280 resolution MRI imaging (14, 47) (Figures 2, 4 and 6). Simulations show that σ_f is the main
281 determinant of hypertrophy (wall volume changes) and σ_{wss} the main determinant of LV size
282 confirming our initial hypothesis. Wall volumes, chamber diameters, wall thickness and end-
283 diastolic compliances are all within an expected range (6, 15, 19).

284 Cardiac remodeling is a complex, multifactorial process, which is importantly driven by
285 changes in myocardial loading conditions as a result of e.g. stenotic or regurgitant valves.
286 Results from this study support the hypothesis that preservation of the clinically accessible
287 biomechanical factors σ_f and σ_{wss} can explain cardiac remodeling patterns in valvular heart
288 disease. It should however be mentioned that genetic factors and comorbidities such as
289 hypertension also play a role and may result in interindividual variation despite similar valve
290 pathology (37). Our findings are in agreement with a previous simulation study showing that a
291 model based on passive and active properties of the individual sarcomeres and with mechano-
292 adaptive control could determine chamber size and myocardial wall volume of all four cardiac
293 chambers in normal physiology (3), but in contrast to this study we use input data extractable
294 from clinical diagnostic imaging and test the algorithms in a different range of loading
295 conditions by including valve pathology.

296 Such simulations models have e.g. been used to explain cardiac chambers size based on fiber
297 stress (σ_f) optimization (3), to reproduce wave dynamics throughout the circulation (32), to
298 explain blood pressure changes with aging (27), to monitor cardiac loading conditions during
299 mechanical support (7, 13), and could be valuable to differentiate and quantify mechanical
300 overload-induced cardiac remodeling in individual patients.

301 While simulation results from this study show how mechanical triggers may be important
302 factors in cardiac remodeling, they cannot uniquely identify which mechanical variables are the
303 actual drivers of remodeling. σ_f and σ_{wss} are good candidates given the agreement between
304 simulations and clinical data. However, other variables such as fiber strain (2) could be
305 complementary driving factors contributing to remodeling. It is intriguing that when calculating
306 myofiber shortening (strain) according to Arts *et al.* (1) (Figure 8) in remodeled AS, it decreases
307 with stenosis severity in agreement with clinical findings (44) despite preserved ejection

308 fraction and increasing LV contractility (end-systolic elastance). The decrease in fiber
 309 shortening (strain) in clinical measurements has been interpreted as a sign of decline in systolic
 310 function (33) but should probably rather be seen as a geometric consequence of wall thickening
 311 in combination with high afterload (44). These clinical and simulation findings speak against
 312 preservation of strain as the principal biomechanical factor determining chamber size, but
 313 deserve further in-depth analysis, to elucidate the precise relation between modeled myofiber
 314 strain on one hand and longitudinal and epi-/endo-cardial circumferential strain as measured
 315 clinically on the other.



316
 317 Figure 8. Measures of systolic function in simulated remodeled aortic stenosis. Ejection fraction
 318 (black) is preserved, while elastance (gray) increases with valve stenosis severity. Myofiber
 319 shortening (strain) (dashed black) decreases with valve narrowing and increasing hypertrophy.

320
 321 Simulations of the disease process can be seen as a longitudinal study on a single individual as
 322 disease severity progresses. However, clinical data conventionally available like those used for
 323 validation in this study (14, 47) are single time point measurements providing a cross-section
 324 of multiple individuals with different degrees of disease severity.

325 Simulations of aortic stenosis produced a concentric remodeling pattern with pronounced LV
 326 hypertrophy for the most severe cases (Figure 3). Patient data reported by Dweck et al. (14)
 327 showed many different kinds of LV remodeling patterns in response to aortic stenosis, including
 328 normal LV and LV decompensation. LV decompensation occurs in the late stages of the

329 diseases when the myocardium cannot adapt to load changes anymore and therefore the
330 remodeling rules cannot be met. This structural limit of the myocardium, possibly influenced
331 both by mechanical material properties and ischemia, has not been included in the modeling
332 assumption and therefore LV decompensation cannot be predicted with the current model
333 implementation. The simulation could however predict the other compensatory LV geometries
334 observed in patients. Firstly, simulations show that aortic maximal area must be small
335 ($< 1.5 \text{ cm}^2$) before the LV begins to remodel. This implies that the LV can preserve a normal
336 geometry down to this aortic valve area. When the adaptive remodeling process starts, it
337 manifests initially as concentric remodeling and ultimately as concentric hypertrophy (Figure
338 2). Dweck et al. reported no correlation between aortic area measurements and degree of LV
339 hypertrophy, which probably is due to a quite narrow range of valve areas ($0.93 \pm 0.32 \text{ cm}^2$).
340 Other authors with larger span of aortic valve areas have found a clear relationship with
341 hypertrophy and found that wall thickness increased proportional to the increase in left
342 ventricular systolic pressure, preserving wall stress (18). In addition, other individual factors
343 that influence hypertrophy such as genetic background and additional comorbidities e.g.
344 hypertension, diabetes and obesity will influence hypertrophy, and this is not taken into account
345 in the simulations. Finally, non-invasive measurements of effective valve area are prone to
346 measurement errors, also with MRI. The clear correlation between aortic area and LV mass in
347 the simulations, occurs mainly for very small aortic areas ($< 0.75 \text{ cm}^2$). Some of the discordance
348 between clinical results and simulations can be explained by the difficulty of measuring these
349 small areas of the stenotic aortic valve using *in vivo* imaging methods, which have limited
350 spatial resolution (echocardiography and MRI both $> 1\text{-}2 \text{ mm}$ (16)). In addition, the generally
351 irregular shape of the stenotic aortic valve area might be of hemodynamic importance. Taken
352 together, the net aortic valve area derived from medical imaging may not be the most robust
353 measurement of disease severity.

354 Simulations showed that mitral and aortic regurgitation resulted in an eccentric remodeling
355 pattern (Figures 4 and 6) in accordance with patient data (47) (Figures 5 and 7). Aortic
356 regurgitation produced a clear hypertrophy of the LV, whereas mitral regurgitation resulted in
357 only a mild hypertrophy (Figure 2), due to a progressive decrease in afterload with worsening
358 regurgitation, since part of the LV output is ejected retrogradely into the low-pressure atrium
359 instead of into aorta. Simulations also showed that the LA increased its size in mitral
360 regurgitation but not in aortic regurgitation, where the opposite was seen, that is a slight
361 decrease in LA size for the most severe cases (Figures 4 and 6). The decrease in LA size in
362 aortic regurgitation may be explained by a decrease in cardiac output, due to lack of

363 autoregulatory control mechanisms preserving systemic flow in our study. The clinical data
364 reported by Uretsky et al. (47) showed poorer correlation between mitral regurgitant volume
365 and LV ESVI ($r^2 = 0.5$) and LA volume ($r^2 = 0.3$) than with LV EDVI ($r^2 = 0.8$). The lack of
366 compensatory baroreflex mediated sympathetic activity in the simulations may explain the
367 slightly larger simulated end-systolic volumes in mitral regurgitation (Figure 5). Our
368 simulations showed however that all three variables are clearly correlated to mitral regurgitant
369 volumes (Figure 5). LV EDVI is the largest of these volumes and it increases the most with
370 increased regurgitant volume, which makes it an easier and more robust variable to measure. In
371 the simulation results for mitral regurgitation, it can also be noticed that mild hypertrophy
372 (defined as an increase in wall volume) does not manifest as an increase in wall thickness,
373 which slightly decreases due to the LV dilatation. Previous simulation work in aortic
374 regurgitation has shown how parameters such as ventricular and aortic wall properties can
375 influence hemodynamic output in a way that is not captured by clinical severity scores (34).
376 Simulations can highlight the most important factors to take into account and clinically measure
377 when evaluating a given disease state in general or more specifically the expected remodeling
378 pattern in an individual patient. As an example, simulations indicate that wall volume or mass-
379 cavity ratio might be alternative indexes of disease severity worthy of clinical evaluation.

380

381 **Limitations**

382 Actual σ_{wss} and σ_f values are currently difficult to measure *in vivo* (see appendix for current σ_{wss}
383 and σ_f selection criteria). A recent study (29) reports MRI estimated mean σ_{wss} in the human left
384 ventricle in the range 0.2-0.6 Pa corresponding to 0.0015-0.0045 mmHg supporting the target
385 value 0.0025 mmHg used in the current study. The target value for mean myofiber stress 120
386 mmHg is supported by Genet *et al* (17) estimating a normal human operating LV myofiber
387 stress range of 2.2-16.5 kPa (16.5-124 mmHg) and Lee et al (25) estimating peak LV myofiber
388 stress to 50-80 kPa (375-600 mmHg) in a group of patients post cardiac surgery due to heart
389 failure. In the absence of more detailed information, we have applied the same values for all
390 four chambers. Refined geometrical assumptions and data from future 3D simulation studies
391 may provide more precise input data that may result in e.g. more realistic atrial sizes. More
392 specifically, our geometrical assumptions about the RV may need refinement in future studies
393 concerning right-sided lesions or pulmonary hypertension, since the infundibulum and RV
394 outlet tract is not taken into consideration in our simplified geometry. The equations relating
395 wall volumes to chamber volumes assume a geometry with rotational symmetry, which is true
396 for the atria and left ventricle, but not for the right ventricle. This would also be a significant

397 limitation, when applying the model to right-sided lesions or pulmonary hypertension, but does
398 not affect our conclusions, since right-sided changes are negligible in this study.

399

400 The calculation of σ_{wss} was based on the assumption of laminar flow through a tube, which is
401 an oversimplification of reality. In fact, the LV shows vortical flow patterns (4). In general,
402 vortexes can be both laminar and/or turbulent and which pattern is seen in ventricular flow is
403 still under investigation (10, 22). This implies that the calculated σ_{wss} might not correspond to
404 the actual σ_{wss} experienced by the chamber walls. However, the target σ_{wss} value was chosen in
405 order to provide physiological hemodynamic output for a normal individual. This simplified
406 assumption will only affect the magnitude of the simulation output during remodeling, but not
407 the overall direction of changes.

408 The present model cannot represent 3D features of the circulatory system. Also, we have
409 assumed homogenous wall thickness. It is likely that differences in σ_f and impact of σ_{wss} exist
410 within the myocardial walls. Dweck et al. (14) report both symmetric and asymmetric
411 remodeling, patterns that cannot be predicted by the type of modeling used in this study
412 (lumped-parameter 0D modeling), which does not provide local 3D information and therefore
413 asymmetric remodeling falls into the concentric remodeling and hypertrophy patterns.
414 However, 0D modeling allows real-time simulation with a standard PC and is therefore a more
415 realistic clinical decision support tool.

416 Compensatory mechanisms such as baroreceptor effects and changes in blood volume to
417 preserve cardiac output were not included in the simulations and neither was vascular
418 remodeling. These mechanisms may explain some of the differences between simulation results
419 and clinical data. Future clinical application of the model may have to include the
420 autoregulatory features of the cardiovascular system.

421 A crucial clinical question is how to differentiate between adaptive and maladaptive
422 remodeling. Unfortunately, this question is currently unresolved and also not well understood
423 in clinical medicine. We can only speculate about ischemia, progressive fibrosis with negative
424 diastolic and systolic effects and exhaustion of the Starling mechanism driven by changes in
425 collagen subtypes, oxidative stress, inflammation, neurohormonal activation and mitochondrial
426 dysfunction (39). Providing “rules” for adaptive remodeling could potentially make it easier to
427 draw the line between adaptive and maladaptive responses through the course of myocardial
428 load history. It is likely not possible to fully understand the maladaptive response without a
429 more detailed simulation of the myocardial sub-cellular structure including vascular supply.

430 Sex and ethnic differences have not been taken into account, which is mainly due to lack of
431 suitable validation studies, but also due to lack of biomechanical hypothesis explaining such
432 differences. Future studies taking not only these factors, but also body size and comorbidities
433 are needed to explore these questions. Importantly, this model-based approach allows to
434 simulate and predict on an individual basis rather than on a group level, which creates an
435 important future advancement towards patient-specific, individualized cardiovascular
436 diagnostics and therapeutics.

437

438 **Clinical implications**

439 The importance of remodeling in clinical cardiac disease is indisputable. By being able to
440 calculate, predict and differentiate the adaptive part of remodeling from other pathological
441 processes such as ischemia, tissue fatigue and genetic disorders, it may be possible to better
442 predict what reversibility can be expected after interventions and better differentiate primary
443 from secondary changes in structural heart disease. Patient-specific simulation of remodeling
444 may therefore in the future aid in decision-making related to interventions and drug therapy.

445

446 **Conclusions**

447 Computer simulations of remodeling show that biomechanical factors alone can explain the
448 major remodeling patterns (eccentric vs concentric LV hypertrophy) seen in left-sided valvular
449 heart disease. These findings both qualitatively and quantitatively support the hypothesis that
450 chamber size and degree of hypertrophy to a large extent can be explained by preservation of
451 myocardial fiber stress and wall shear stress. Additional clinical and experimental studies in
452 different pathologies are needed to further validate these results and potentially refine the
453 modeling assumptions.

454 Appendix

455 Additional information about the model and simulation methods are presented in the following
456 sections.

457 Cardiovascular model overview

458 The cardiovascular model used in this study is constituted of multiple lumped-parameter
459 segments of the circulatory system and has previously been described (8). The four cardiac
460 chambers are modeled as time-varying elastances, the arterial segments are modeled as 4-
461 element Windkessel models and the cardiac valves change their area gradually during opening
462 and closing (31). The function of the pericardium to prevent cardiac enlargement and the motion
463 of the intraventricular septum are also included in the model. The reader is referred to the article
464 by Broomé et al. (8) for a full description of the model structure and strategies for parameter
465 selection. Some selected definitions and model equations useful for this specific study are
466 described below.

467 Definitions

468 Variables changing with time are indicated with lower-case letters. Constant parameters are
469 indicated with upper-case letters.

470 The time-varying elastance $e(t)$ in each cardiac chamber is defined by the Double-Hill equation
471 (eq. 1.A):

$$e(t) = e_{max}(v_{ed}, q) \cdot a \cdot \left[\frac{\left(\frac{t}{\alpha_1 \cdot T}\right)^{n_1}}{1 + \left(\frac{t}{\alpha_1 \cdot T}\right)^{n_1}} \cdot \frac{1}{1 + \left(\frac{t}{\alpha_2 \cdot T}\right)^{n_2}} \right] + e_{min}(v) \quad 1.A$$

472

473 v_{ed} is the end diastolic volume, q is the flow through the outflow valve of the chamber, t is the
474 time, T is the time period of one heart cycle, α_1 , α_2 , n_1 and n_2 are dimensionless constants
475 determining the shape of the elastance curve and thereby the duration of contraction and
476 relaxation. $e_{min}(v)$ is a variable elastance defining the diastolic pressure-volume relation as
477 further described in equation 3A.

478 The value of e_{max} varies in a way that reproduces the Frank-Starling mechanism according to
479 eq. 2.A:

$$e_{max}(v_{ed}, q) = E_{max} \cdot \left[1 - \left(\frac{v_{ed}}{V_{ed,max}} \right)^4 \right] \cdot \left[1 - \frac{q}{Q_{max}} \right] \quad 2.A$$

480

481 Where E_{\max} is the systolic contractility constant, $V_{\text{ed,max}}$ is the maximum chamber volume
482 defining the curvature of the end-systolic elastance and Q_{\max} the maximum flow in the
483 corresponding chamber representing the internal chamber flow resistance (8).

$$e_{\min}(v) = E_{\min} \cdot e^{\sigma \cdot (v-v_0)} \quad 3.A$$

484 Where E_{\min} is the passive stiffness constant, σ is a constant factor regulating the shape of the
485 diastolic elastance curve and v_0 is the volume at which the end-systolic pressure volume
486 relationship meet the volume axis in a pressure-volume diagram, representing the unstressed
487 chamber volume.

488 E_{\max} and E_{\min} are constant values and are referred to as systolic contractility and passive stiffness
489 in the main text of this study, respectively. They are input parameters of the model and are not
490 the same as the end-systolic and end-diastolic elastance. End-systolic and diastolic elastance
491 can be calculated as pressure/volume at end-systole and end-diastole and are the result of the
492 complex interaction of E_{\max} , E_{\min} , flows and volumes.

493 Myocardial volume adaptation

494 An increase in systolic contractility due to remodeling is a result of an increased number of
495 myocardial fibers or sarcomeres within each fiber. Many fibers and/or sarcomeres imply a
496 larger myocardial mass. Similarly, a chamber with thicker walls and larger myocardial mass
497 (excluding the presence of fibrotic tissue) would be a chamber with increased resistance to
498 myocardial strain (referred to as passive stiffness in the medical literature). Based on the
499 assumptions that systolic contractility and passive stiffness of each cardiac chamber are directly
500 proportional to the amount of cardiac muscle present in the chamber wall, the total myocardial
501 mass was distributed among the four cardiac chambers in proportion to the sum of the passive
502 stiffness and systolic contractility constant. The origin of this assumption is that in simple
503 geometries with constant Young's modulus, a direct relation exists between exerted strain and
504 material thickness, although many confounding factors such as co-existing fibrosis may
505 influence the analysis in real patients. The set myocardial volume was then automatically tuned
506 by the adaptation rules and changed its value from 160 mL to 148 mL, as shown in Table 1 in
507 the main text. Heart rate was 72 min^{-1} for all simulations.

508 **Calculations – weighted mean**

509 During simulation, hemodynamics variables are updated with a frequency of 4 kHz and new
510 values are based both on the latest parameter changes and the previous simulated values in a
511 weighted manner, according to the following running mean equation:

512
$$x(t + 1) = 0.999 * x(t - 1) + 0.001 * x(t)$$

513 A stable mean value is usually reached within 30-60 seconds after each change of physiological
514 state of the model, and memory of previous states is therefore lost well in advance of data
515 harvesting.

516 **Sensitivity to wall shear stress and fiber stress**

517 The target FS was 120 mmHg and the target WSS was 0.0025 mmHg. These values were
518 initially chosen of the same order of magnitude as systolic ventricular pressure and measured
519 myocardial stress (systolic stress of ~ 160,000 dyn/cm² corresponding to ~ 120 mmHg) (18)
520 and of measured WSS in large arteries (0.3-1.3 Pa, corresponding to 0.0023-0.0098 mmHg)
521 (36). The final target values were then tuned to provide physiological hemodynamics as a
522 starting point for simulations (Table 1A).

523 We quantitatively assessed the sensitivity of the main hemodynamics variables and LV
524 properties for an increase and decrease of WSS and FS of 20 % in aortic regurgitation with
525 valve minimum area equal to 0.3 cm² corresponding to a regurgitant flow of 66 mL (See Table
526 1A). The effects of changing target fiber and wall shear stress on left ventricular size and wall
527 thickness was also explored in the full range of aortic regurgitations as seen in Figure 1A. In
528 summary, the remodeling adaptation target values had the largest impact on hemodynamics and
529 ventricular properties in simulations of severe cases of valve disease. Changes in fiber stress
530 target mainly affects wall thickness/wall volumes, while changes in wall shear stress target
531 mainly affects chamber diameter/volumes. Our chosen target values are supported both by the
532 literature, hemodynamic output and the changes in left ventricular properties.

533

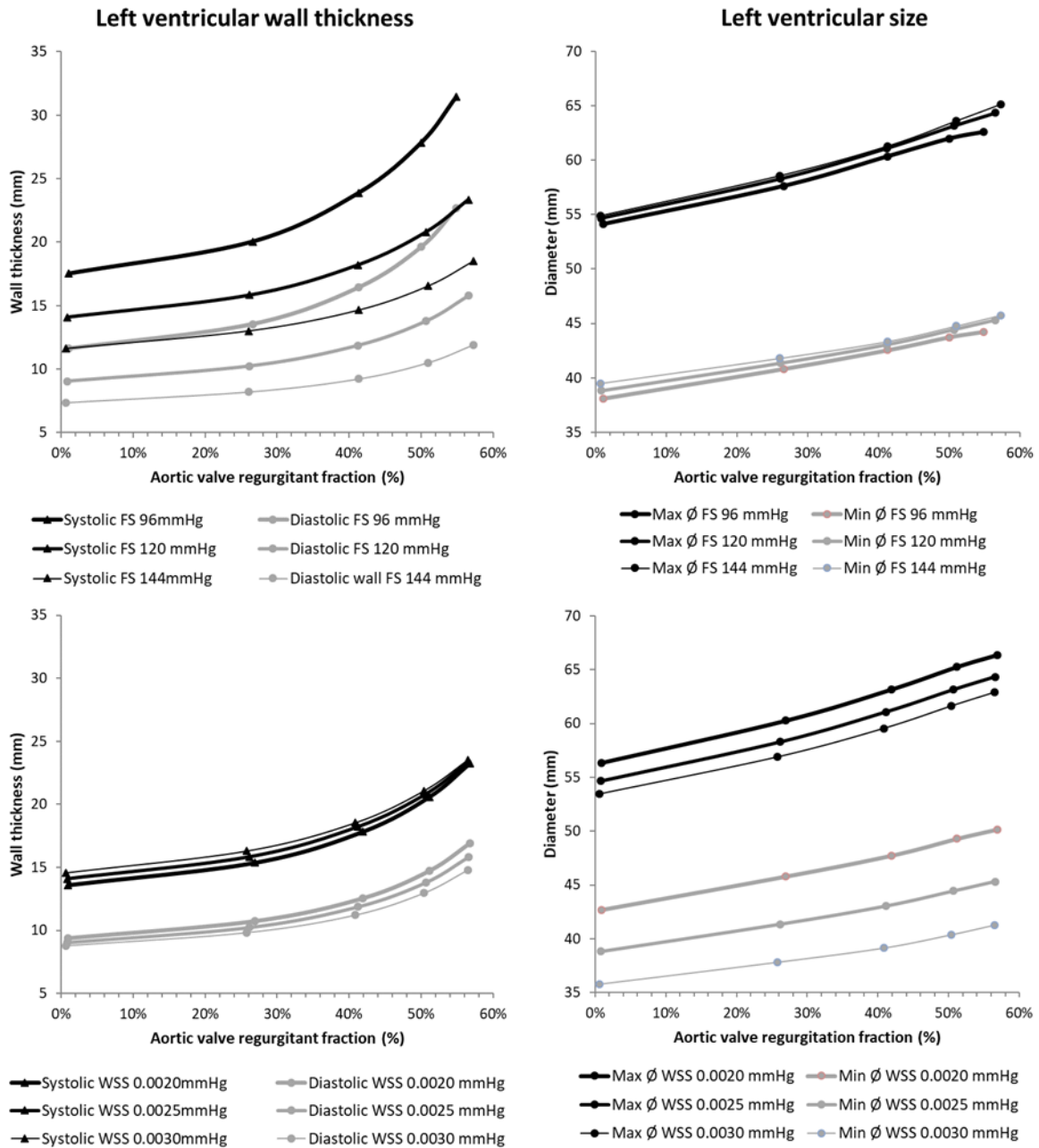
534 Table 1A – Sensitivity of main hemodynamic variables (model output*) to changes in target
 535 wall shear stress and fiber stress.

| | Systolic arterial pressure | Diastolic arterial pressure | Mean arterial pressure | Cardiac output | LV EDV | LV ESV | LA pressure | RA pressure | LV min diameter | LV wall volume |
|--------------------------|----------------------------|-----------------------------|------------------------|----------------|--------|--------|-------------|-------------|-----------------|----------------|
| Fiber stress | % | | | | | | | | | |
| +20% (144 mmHg) | +1 | +3 | +4 | +6 | +4 | +5 | -1 | -4 | +1 | -18 |
| -20% (96 mmHg) | +6 | +2 | +1 | +1 | -3 | -2 | +26 | -7 | -1 | +78 |
| Wall shear stress | % | | | | | | | | | |
| +20% (0.003 mmHg) | +6 | +5 | +6 | +9 | -5 | -23 | +10 | -2 | -8 | +5 |
| -20% (0.002 mmHg) | -2 | -2 | -3 | -4 | +11 | +37 | +1 | -7 | +11 | +15 |

536

537 *Simulations were performed for aortic regurgitation with minimum area equal to 0.3 cm² (moderate severity).

538 LV = left ventricle; EDV = end-diastolic volume; ESV = end-systolic volume; LA = left atrium; RA = right atrium.



539

540 Figure 1A. Sensitivity analysis showing effects of changing target fiber stress and wall shear
 541 stress on left ventricular wall thickness and size in aortic regurgitation. A range of regurgitant
 542 areas resulting in a regurgitant stroke volume fraction of up to 60% was explored. Changing
 543 the target fiber stress influences wall thickness more than ventricular size as shown in the two
 544 upper panels. The lower panels show that changing target wall shear stress mainly influences
 545 left ventricular size. In general, offsets are more influenced than slopes. Abbreviations: FS;
 546 fiber stress, WSS; wall shear stress.

547

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552

553 **Disclosures**

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556

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709 **Legends**

710 Figure 1. (A) Atria. Both the left and right atrium are approximated to be spheres with an inner
711 radius of r , a wall thickness of h , an inner blood volume of v and a wall volume of v_{wall} . (B)
712 Left ventricle. The left ventricle is approximated to be a half ellipsoid with max inner radius r ,
713 wall thickness h and a length of $3r$. (C) Right ventricle. The right ventricle is approximated to
714 be a quarter ellipsoid with max inner radius r , wall thickness h and a length of $3r$.

715
716 Figure 2. Simulation output of changes in left ventricular end-diastolic volumes and wall
717 volumes in valvular disease with varying valve areas. Aortic stenosis (AS), mitral regurgitation
718 (MR) and aortic regurgitation (AR). Valve areas for each simulation step are indicated in the
719 figure. AS result in concentric hypertrophy and AR and MR in eccentric hypertrophy (more
720 pronounced hypertrophy in AR).

721
722 Figure 3. Simulation output of different degrees of severity of aortic stenosis with myocardial
723 remodeling. A small aortic opening area results in a large increase in systolic and diastolic wall
724 thickness, left ventricular wall volume and a slight decrease in chamber diameter.

725
726 Figure 4. Simulation output of different degrees of severity of mitral regurgitation with
727 myocardial remodeling.

728
729 Figure 5. Comparison between simulation output in mitral regurgitation and clinical data from
730 Uretsky et al. (47). The linear regression equations are shown in the lower part of each panel.

731
732 Figure 6. Simulation output of different degrees of severity of aortic regurgitation with complete
733 myocardial remodeling based on both fiber stress and wall shear stress in the upper row. The
734 middle row shows adaptation of fiber stress excluding adaptation of wall shear stress and the
735 bottom row adaptation of wall shear stress excluding adaptation of fiber stress. Wall shear stress
736 induced dilatation and wall thinning occurs in the bottom row, while wall volume increase with
737 wall thickening occurs in the middle row with only fiber stress adaptation. Both mechanisms
738 are needed for a realistic adaptive remodeling process as seen in the upper row.

739
740 Figure 7. Comparison between simulation output in aortic regurgitation and clinical data from
741 Uretsky et al. (47). The linear regression equations are shown in the lower part of each panel.

742 Figure 8. Measures of systolic function in simulated remodeled aortic stenosis. Ejection fraction
743 (black) is preserved, while elastance (gray) increases with valve stenosis severity. Myofiber
744 shortening (strain) (dashed black) decreases with valve narrowing and increasing hypertrophy.
745

746 Table 1. Start values representing normal physiology at mean wall shear stress 0.0025 mmHg
747 and mean myofiber stress 120 mmHg in all chambers. Gray columns show baseline elastance
748 values and white columns chamber dimensions derived from elastance values using the
749 geometric assumptions and remodeling algorithms described in the main text.
750

751 Table 2. – Main hemodynamic variables (simulation output) for the normal case and three
752 different degrees of severity of valve diseases.

753
754 Figure 1A. Sensitivity analysis showing effects of changing target fiber stress and wall shear
755 stress on left ventricular wall thickness and size in aortic regurgitation. A range of regurgitant
756 areas resulting in a regurgitant stroke volume fraction of up to 60% was explored. Changing
757 the target fiber stress influences wall thickness more than ventricular size as shown in the two
758 upper panels. The lower panels show that changing target wall shear stress mainly influences
759 left ventricular size. In general, offsets are more influenced than slopes. Abbreviations: FS;
760 fiber stress, WSS; wall shear stress.

761
762 Table 1A – Sensitivity of main hemodynamic variables (model output*) to changes in target
763 wall shear stress and fiber stress.