



Left Ventricular Trabeculations Decrease the Wall Shear Stress and Increase the Intra-Ventricular Pressure Drop in CFD Simulations

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The aim of the present study is to characterize the hemodynamics of left ventricular (LV) geometries to examine the impact of trabeculae and papillary muscles (PMs) on blood flow using high performance computing (HPC). Five pairs of detailed and smoothed LV endocardium models were reconstructed from high-resolution magnetic resonance images (MRI) of ex-vivo human hearts. The detailed model of one LV pair is characterized only by the PMs and few big trabeculae, to represent state of art level of endocardial detail. The other four detailed models obtained include instead endocardial structures measuring $\geq 1 \text{ mm}^2$ in cross-sectional area. The geometrical characterizations were done using computational fluid dynamics (CFD) simulations with rigid walls and both constant and transient flow inputs on the detailed and smoothed models for comparison. These simulations do not represent a clinical or physiological scenario, but a characterization of the interaction of endocardial structures with blood flow. Steady flow simulations were employed to quantify the pressure drop between the inlet and the outlet of the LVs and the wall shear stress (WSS). Coherent structures were analyzed using the Q-criterion for both constant and transient flow inputs. Our results show that trabeculae and PMs increase the intra-ventricular pressure drop, reduce the WSS and disrupt the dominant single vortex, usually present in the smoothed-endocardium models, generating secondary small vortices. Given that obtaining high resolution anatomical detail is challenging *in-vivo*, we propose that the effect of trabeculations can be incorporated into smoothed ventricular geometries by adding a porous layer along the LV endocardial wall. Results show that a porous layer of a thickness of $1.2 \cdot 10^{-2}$ m with a porosity of 20 kg/m² on the smoothed-endocardium ventricle models approximates the pressure drops, vorticities and WSS observed in the detailed models.

Keywords: trabeculae, papillary muscles, left ventricular modeling, left ventricular hemodynamics, porosity

Detailed LV CFD Simulations

1. INTRODUCTION

Computational cardiac modeling has become important as a non-invasive modality to study the overall cardiac function (Trayanova, 2011; Taylor et al., 2013). Recently, regulatory bodies are encouraging and supporting the use of *in-silico* modeling to reduce animal experimentation. Within this context, models of cardiac hemodynamics have yet to be improved. The majority of the hemodynamic cardiac computational simulations consider simplified geometries with smoothed endocardial surfaces (Doost et al., 2015; Khalafvand et al., 2015; Imanparast et al., 2016), mostly due to a lack of high-resolution, fast and safe *in-vivo* imaging techniques. It is also true that solving highly detailed models require computationally expensive simulations that can only be carried out using HPC.

In reality the heart anatomy is complex and all individuals have their own unique anatomies. The interior of the cardiac chambers is not smooth: it is populated by PMs, trabeculae of different sizes and false tendons (Gao et al., 2014). In the LV, PMs are the muscles responsible for properly positioning the chordae tendinae during systole to optimize mitral valve leaflet coaptation. Trabeculae are complex muscular structures that are unique to a given human heart, mostly consisting of myocytes, that protrude from the endocardial wall into the interior of the ventricle and present a sponge-like structure. The primary role of the trabeculae in the overall cardiac function remains unknown, but they are often associated with the Purkinje network.

State of the art LV CFD simulations, employing detailed endocardial structure models, have been created from either MRI or computed tomography (CT) in-vivo modalities (Chnafa et al., 2016; Lantz et al., 2016; Vedula et al., 2016), but they only incorporated PMs and a few large trabeculae. In previously reported studies, Chnafa et al. (2016) used 4D MR images to reconstruct the LV geometry, characterized only by PMs, and prescribe physiological deformations using numerical treatments. In this way the author could study blood flow instabilities within the ventricular cavity and found out that high-frequency flow fluctuations can be common in normal LVs. Both Vedula et al. (2016) and Lantz et al. (2016) added also few big trabeculae together with the PMs in their LV geometries and studied the impact of these endocardial structures on the blood flow by comparing simulations results with smoothedendocardium ventricles. Vedula et al. (2016) reconstructed the LV geometry from high-resolution 4D CT scans and applied prescribed mesh deformation based on immersed boundary method. The authors observed a "scrambling" of blood flow vortices produced by PMs and trabeculae, which caused the generation of deeper and more complex vortices that were not present in the smoothed model. In this way, trabeculations help diastolic filling and, during systole, they help ventricular washout by wringing out the blood flow out from the apex. Lantz et al.

(2016) extracted the LV endocardial surface and wall motion over time from 4D CT data. In contrast with Vedula et al. (2016) and Lantz et al. (2016) did not observe any deep penetration of the mitral inflow jet toward the apex: the jet strongly interacted with the PMs and was diverted toward the outflow tract. However, both papers have demonstrated that the detailed anatomies of LV endocardium have important influences on blood flow dynamics: in particular, particle tracking used by Lantz et al. (2016) demonstrated that blood flow interacted with trabeculae and PMs, creating vortices around the endocardial spaces between the trabeculations. More vortices appeared during diastole in the detailed LV as compared to the smoothed one, and PMs redirected blood flow and generated a large vortex, which was not present in the smoothed model. Finally, it was shown that the presence of trabeculations created a region where the flow appeared to be stagnant during five cardiac cycles, which is impossible to reproduce with smoothed endocardium models. While Vedula et al. (2016) and Lantz et al. (2016) considered the PMs and few trabeculae, the level of detail and the amount of trabecular structures in LV geometry reconstructions was not as high as in Kulp et al. (2011), who segmented detailed endocardial structures from high-resolution 4D CT data. The authors studied the interaction between trabeculations and the blood flow by deforming the initial 3D mesh in each following frame. Results showed how the complex endocardial surface caused the blood to move through the empty spaces between the trabeculations and fill these cavities during diastole.

In this paper we used highly detailed anatomical LV endocardium models to characterize the effects of trabeculae and PMs on the blood flows using CFD simulations. Four detailed LV geometries were reconstructed from high resolution imaging data of perfusion fixed human hearts (2 male and 2 female), which were obtained at the Visible Heart[®] Laboratory (Atlas of Human Cardiac Anatomy, RRID:SCR_015734). Detailed and smoothed endocardial models were reconstructed for each of the four hearts to quantify the differences between these two cases and thus characterize the impacts of PMs and trabeculae on ventricular hemodynamics. The level of detail in these reconstructions of the endocardial structures was, to the best of our knowledge, the highest ever achieved for this kind of study: the average size of the smallest structures reconstructed measures about 1 mm² in cross-sectional area.

A fifth (male) LV geometry, named *control LV*, was reconstructed from the human hearts high resolution images dataset, together with its smoothed equivalent. This model was only characterized by PMs and few large trabeculae: in this way we could compare simulation results obtained from the highly detailed models described previously to the ones from an LV geometry which is similar in detail to those present in literature (Kulp et al., 2011; Chnafa et al., 2016; Lantz et al., 2016; Vedula et al., 2016).

Through CFD simulations we aim to characterize the hemodynamics inside detailed vs. smoothed human ventricular anatomies by quantifying the trabecular volume, intraventricular pressure drop, WSS and vorticity within the LV cavities. Furthermore, we propose that a porous layer can be added to the LV endocardium to compensate for the absence of

Abbreviations: LV, Left Ventricle; PMs, Papillary Muscles; HPC, High Performance Computing; MRI, Magnetic Resonance Imaging; CFD, Computational Fluid Dynamics; WSS, Wall Shear Stress; CT, Computed Tomography; BSC, Barcelona Supercomputing Center; PBS, Phosphate Buffered Saline; FE, Finite Element; FSI, Fluid Structure Interaction.

trabeculae within smoothed ventricular hemodynamic models. Our main findings show that the presence of trabeculae alters significantly the blood flow by increasing intra-ventricular pressure drop, reducing the shear stress at the ventricular walls and generating multiple secondary vortices, absent in smoothwalled ventricle simulations. Furthermore, our results show that indeed a porous layer can compensate for the absence of trabeculations inside simplified ventricular models by increasing the intra-ventricular pressure drop, by reducing the wall shear stress at the interface of the porous layer and by increasing the amount of vortex structures within the LV.

2. MATERIALS AND METHODS

2.1. Left Ventricular Models

The five LV models used in this work were reconstructed from high-resolution MR images obtained from *in vitro* perfusion of fixed human hearts. The research uses of these heart specimens have received appropriate approval from both the University of Minnesota's Institution Review Board and LifeSource Research Committee (Minnesota's non-profit procurement donation organization). The hearts were recovered from organ donors whose hearts were not viable for transplantation. Written and informed consents were obtained from the donors families which follow the wishes of the donor. The database is open to public access.

DICOM data sets were acquired utilizing a 3T Siemens scanner with 0.44×0.44 mm in-plane resolution and slice thickness of 1 to 1.7 mm. The hearts were fixed with 10% formalin in phosphate buffered saline (PBS) solution for at least 24 h under 40–50 mmHg of pressure and then stored in 10% formalin. The five hearts DICOM datasets are shown in **Figure 1**.

Image segmentation was carried out with Fiji software (Fiji, RRID:SCR_002285), using the maximum entropy-based thresholding algorithm (Qi, 2014), followed by endocardial surface reconstruction using marching cubes algorithm in Seg3D (Seg3D, RRID:SCR_002552). The relative high contrast of the images guaranteed that the thresholding produced detailed endocardial models. The smoothed models were generated from the detailed geometries by manually deleting trabeculae and PMs and closing holes on associated surfaces using ReMESH software (ReMESH, RRID:SCR_015735). Autodesk Meshmixer (Autodesk Meshmixer, RRID:SCR_015736) sculpting software was then used to adjust the smoothed endocardial surface as to maintain the same outline for both the smoothed and detailed geometries.

The *control LV*, as a representative of a state of the art anatomical model, was reconstructed using a regularized region growing algorithm of ITK-SNAP (ITK-SNAP Medical Image Segmentation Tool, RRID:SCR_002010) to get only large scale anatomical detail from the images. The algorithm allowed controlling the smoothness of the extracted contour making it easier to obtain the smoothed surface with just the PMs and a few large trabeculae (approximately 5 mm² in cross-sectional area). The obtained level of detail for the *control LV* was similar to the reported models used in recent publications on blood flow analysis in LV such as Vedula et al. (2016) and Chnafa et al. (2016).

In order to let the flow develop, a 50 mm long tube was attached at the inlet (corresponding to the mitral valve orifice) and a 70 mm tube at the outlet (corresponding to the aortic valve orifice). Each tube base matched exactly the corresponding valvular ring plane. Tubes were created for every given LV model using ParaView (ParaView, RRID:SCR_002516).

The resulting surface meshes were uniformly remeshed using Remesh and then volumetric tetrahedral meshes were generated using an isosurface-stuffing-based algorithm (Labelle and Shewchuk, 2007) with an in-house mesher developed at the Barcelona Supercomputing Center (BSC). The volumetric meshes had adaptive element size, with volumes varying from 10^{-7} mm³ to $1.9 \cdot 10^{-2}$ mm³, with an average size of $5.7 \cdot 10^{-5}$ mm³. Wireframe zoomed images of the tetrahedral meshes can be found in Figure S1.

The five LV anatomies, both smoothed and detailed, are shown in **Figure 2**. A more detailed view is reported in Figure S2. The medical histories and related information can be found in Table 1 of the Supplementary Materials. The ventricular volume of each mesh is reported in Table 2 of the Supplementary Materials.

2.2. Hemodynamic Simulations

To carry out CFD simulations the walls were defined as rigid, noslip boundary conditions. For the outlet, a stabilizing boundary condition employed a baseline pressure of 10.7 kPa (80 mmHg, a normal end-diastolic arterial pressure) plus an outflow resistance (Bazilevs et al., 2009). Blood viscosity was set to 0.0035 kg/(m \cdot s) and density to 1,060 kg/m³.

Hemodynamic simulations solving continuity and Navier-Stokes equations for incompressible flows were run the MareNostrum 4 supercomputer on (MareNostrum, RRID:SCR_015737) and on Archer (ARCHER, RRID:SCR_015854), UK supercomputer, using Alya, the BSC's in-house, parallel multi-physics, HPC solver (Houzeaux et al., 2009; Vazquez et al., 2016).

Simulations were carried out using a low dissipation finite element (FE) strategy described below. The Navier-Stokes equations for a fluid domain Ω bounded by $\Gamma = \partial \Omega$ within the time interval (t_0, t_f) reside in calculating a velocity **u** and a kinematic pressure *p* so that Equations (1, 2) are satisfied; where ν is the kinematic viscosity, **f** is the vector of external body forces and **S**(**u**) is the rate-of-strain tensor.

$$\partial_t \mathbf{u} + (\mathbf{u} \cdot \nabla) \mathbf{u} - 2\nu \nabla \cdot \mathbf{S}(\mathbf{u}) + \nabla p - \mathbf{f} = \mathbf{0} \quad \text{in } \Omega \times (t_0, t_f)$$

$$\nabla \cdot \mathbf{u} = 0 \qquad \text{in } \Omega \times (t_0, t_f) \tag{2}$$

To obtain weak or variational formulation of the Navier-Stokes equations Equations (1, 2), we introduced the spaces of vector functions $\mathbf{V}_D = \mathbf{H}_D^1(\Omega)$, $\mathbf{V}_0 = \mathbf{H}_0^1(\Omega)$ and $Q = L^2(\Omega) / \Re$. $L^2(\Omega)$ is the space of square-integrable functions, $H^1(\Omega)$ is a subspace of $L^2(\Omega)$ formed by functions whose derivatives belong also to





 $L^2(\Omega), H_D^1(\Omega)$ is a subspace of $H^1(\Omega)$ which satisfies Dirichlet boundary condition on Γ . $H_0^1(\Omega)$ is a subspace of $H^1(\Omega)$ whose functions are zero on Γ ; and $\mathbf{H}_D^1(\Omega)$ and $\mathbf{H}_0^1(\Omega)$ are their vector counterparts in a two- or three-dimensional space. (\cdot, \cdot) determines the standard L^2 inner product. For the evolutionary case, $\mathbf{V}_t \equiv L^2(t_0, t_f; \mathbf{V}_D)$ and $Q_t \equiv \mathcal{D}'(t_0, t_f; Q)$ were introduced, where $L^p(t_0, t_f; X)$ is the space of time dependent functions in a normed space X so that $\int_{t_0}^{t_f} ||f||_X^p dt < \infty, 1 \le p < \infty$ and Q_t consists of mappings whose Q-norm is a distribution in time. The weak form of problem (Equations 1, 2) with the boundary conditions is then: Find $\mathbf{u} \in \mathbf{V}_t$, $p \in Q_t$ such that Equation (3) is satisfied for every $(\mathbf{v}, q) \in \mathbf{V}_0 \times Q$.

$$(\partial_t \mathbf{u}, \mathbf{v}) + (\mathbf{u} \cdot \nabla \mathbf{u}, \mathbf{v}) + 2\nu(\mathbf{S}\mathbf{u}, \nabla \mathbf{v}) - (p, \nabla \cdot \mathbf{v}) + (q, \nabla \cdot \mathbf{u}) - (\mathbf{f}, \mathbf{v}) = \mathbf{0},$$
(3)

Moreover, in the previous equations the non-linear term convective form reported in Equation (4) was used, which is the most frequent choice in computational practice. Using Equation (2), other non-linear term forms can be derived, which are the same at the continuous level but do have different properties at the discrete level. In Equation (5) we consider the energy, momentum and angular momentum conserving form recently proposed in Charnyi et al. (2017). A non-incremental fractional-step method was used for pressure stabilization. This allows the use of finite element pairs which do not satisfy the inf-sup conditions, like the equal order interpolation for the velocity and pressure used in this work. An energy conserving Runge-Kutta explicit method lately proposed by Capuano et al. (2017) along with an eigenvalue based time-step estimator (Trias and Lehmkuhl, 2011) were used in order to time integrate the set of equations. This methodology, recently proposed by



Lehmkuhl et al. (2017), follows the principles of Verstappen and Veldman (2003), generalized for unstructured finite volumes by Jofre et al. (2013) and Trias et al. (2014) but in a FEM framework. The presented methodology has been successfully validated and benchmarked vs. other popular CFD approaches and experimental data in the bioengineering flows environment in Koullapis et al. (2017).

$$NL_{conv}\left(\mathbf{u}\right) = \mathbf{u} \cdot \nabla \mathbf{u} \tag{4}$$

$$NL_{emac}\left(\mathbf{u}\right) = 2\mathbf{S}\left(\mathbf{u}\right)\mathbf{u} + \left(\nabla \cdot \mathbf{u}\right)\mathbf{u}$$
(5)

We performed the following simulations:

- 1. *Constant inflow.* This was done to characterize purely the influences of the geometries on the hemodynamics. A constant, flat-profile, blood flow velocity of 0.55 m/s (peak normal transmitral inflow velocity Fernández-Pérez et al., 2012) was applied at the inlet of all models.
- 2. Synthetic E-A wave mitral valve inflow. A synthetic E-A wave was created as a combination of two cosine functions as in Equation (6). A was the maximum amplitude of the wave, $t_{0,E}$, $t_{0,A}$, and $t_{1,E}$, $t_{1,A}$ were the initial and final time of E and A waves respectively. $t_{p,E}$ and $t_{p,A}$ were the time corresponding to the peaks of E and A waves and t was the simulation duration. The parameters of the wave were chosen to represent a standard E-A wave of a healthy individual (Fernández-Pérez et al., 2012); their values and the corresponding function are shown in **Figure 3**.
- 3. Constant inflow with a porous layer. A layer with the properties of a uniform porous material was added to the interior walls of the smoothed-endocardium models (see Figure 4). The motivation is that a porous layer is easy to implement and may provide similar hemodynamic characteristics than the irregular endocardial wall. The initial permeability value considered was the minimum of well graded gravel (5 \cdot 10⁻⁴ m/s), that yields a porosity of 7 kg/m² (Standard, 1999). The thickness and permeability of the porous material were empirically selected for model A so that the smoothedendocardium model with this layer generates similar intraventricular pressure drop as the corresponding detailed model. In order to solve the CFD with the porous material, the momentum conservation equation was stated in the form of Darcy's law (Equation 6), where μ is the dynamic viscosity, k is the permeability, u is the velocity and p is the pressure, and added to the Navier-Stokes equations. To find the optimal combination of thickness and porosity of the porous layer, we did a sensitivity analysis varying the thickness from $1 \cdot 10^{-2}$ to $1.2 \cdot 10^{-2}$ m with porosities of 7, 20, 40, and 70 kg/m². The parameters of the porous layer selected for model A was applied to models B, C, and D to verify if a single porous layer approximation can reproduce the hemodynamic behavior in the rest of the models.

$$\nu(t) = \begin{cases} \frac{A_E}{2} \left(1 + \cos\left(\frac{2\pi(t - t_{p,E})}{t_{1,E} - t_{0,E}}\right) \right) & t_{0,E} \le t \le t_{1,E} \\ 0 & t_{1,E} < t < t_{0,A} \\ \frac{A_A}{2} \left(1 + \cos\left(\frac{2\pi(t - t_{p,A})}{t_{1,A} - t_{0,A}}\right) \right) & t_{0,A} \le t \le t_{1,A} \end{cases}$$
(6)

$$u = -\frac{1}{\mu}k(\nabla p) \tag{7}$$

2.3. HPC Characteristics

HPC characteristics for both constant and transient inflow simulations in terms of cores, total simulation time and time step are reported in **Tables 1**, **2**. Every simulation, with both constant and transient inflow, was run up to 800 ms. Information on the scalability of the incompressible flow module within Alya multiphysics solver can be found in the works of Houzeaux et al. (2009) and Vazquez et al. (2016). The elements-per-core ratio that was used to run these hemodynamic simulations was about 25,000.

2.4. Geometric Markers

The following geometrical markers were used:

Trabecular volume was calculated as a difference between the volume of the convex hull of the detailed-endocardium LV model and the volume of the model itself.

The angle between inlet and outlet was the angle between the vectors normal to the two valvular planes (mitral and aortic). An illustration can be seen in **Figure 5**.

The distance between inlet and outlet was the distance between the mitral and aortic valves centers. An illustration can be seen in **Figure 5**.

2.5. Hemodynamic Analysis

2.5.1. Intra-ventricular Pressure Drop

The pressure distributions were analyzed within 15 mm long volumes of both inlet and outlet tubes. The sections were chosen right at the inlet of the mitral and at the outlet of the aortic valves. The histograms were normalized to unit area under the curve and bin width was calculated using the Freedman-Diaconis rule. As the pressure distributions were non-Gaussian (**Figure 6**), the intra-ventricular pressure drop was calculated as the difference between the inlet and outlet pressure mode. The pressure difference was then averaged over the ten last time frames (approximately 50 ms of simulations), during steady flow. From these results, we calculated the intra-ventricular pressure drop difference (ΔP_{diff}) as the difference of the detailed and smoothed pressure drops for every studied LV.

2.5.2. WSS on the Ventricular Walls

WSS histograms were computed for every LV cavity (**Figure** 7) and normalized using the Freedman-Diaconis rule to choose the width of the bins. Given that these distributions were upward skewed, the median was used to analyze the WSS of each model. The total magnitude range and the mode are also reported for each case. In the case of the porous layer simulations, the median and mode WSS were calculated on the interface between the porous layer and the blood flow.

2.5.3. Vorticity

Coherent structures were analyzed in both steady and transient inflow simulations applying the Q-criterion method (Hunt et al., 1988; Chakraborty et al., 2005). The applied thresholds for vortex visualization were 5,000 s⁻² and 1,000 s⁻² for steady and

Hearts	A	_	8	~	5	5		۵	ш	
Geometry	Smoothed	Detailed	Smoothed	Detailed	Smoothed	Detailed	Smoothed	Detailed	Smoothed	Detailed
Area inlet [m ²]	6.10 ⁻⁴	0−4	10.2 .	10.2 · 10 ⁻⁴	5.7 .	5.7 . 10 ⁻⁴	$9.4 \cdot 10^{-4}$	10-4	13.9 . 10 ⁻⁴	0-4
Area outlet [m ²]	$2.5 \cdot 10^{-4}$	10-4	2.4 .	2.4 · 10 ⁻⁴	3.1	3.10 ⁻⁴	1.8	1.8 · 10 ⁻⁴	$4.9 \cdot 10^{-4}$)-4
a [degrees]	49	6	72.2	.2	56	58.8	43	43.3	73.7	2
<i>d</i> [m]	$2.1 \cdot 10^{-2}$	10-2	1.9.1	1.9 · 10 ⁻²	2.3 .	2.3 · 10 ⁻²	2.3	2.3 · 10 ⁻²	2.3.10 ⁻²)-2
Trabeculae [%]	21	21.4	26	26.6	16	19.6	21	21.3	10.9 ^a	ß
Volumetric mesh elements	3,012,240	2,329,175	3,545,080	5,525,858	1,773,680	5,039,205	1,588,160	3,251,790	2,583,680	4,272,960
Volumetric mesh points	562,926	476,951	632,642	1,140,117	333,305	1,038,890	204,189	671,442	541,204	764,903
Reynolds number at inlet	6,004	04	4,605		4,4	4,477	5,7	5,764	7,009	Õ
ΔP [kPa]	1.3 ± 0.1	1.5 ± 0.1	3.8 ± 0.04	4.1 ± 0.1	0.7 ± 0.06	0.8 ± 0.05	2.2 ± 0.1	4.9 ± 0.2	2.3	2.5 ± 0.1
ΔP _{diff} [kPa]	0.2	5	0.3	e	Ö	0.1	2.	2.7	0.2	
WSS mode [Pa]	0.35	0.05	0.06	0.05	0.75	0.05	0.45	0.05	0.15	0.25
WSS median [Pa]	0.51	0.39	1.02	0.34	1.23	0.67	0.63	0.66	0.84	0.52
Total vortex surface [m ²]	29.1 · 10 ⁻³	35.6 - 10 ⁻³	33.8 - 10 ⁻³	60.4 · 10 ⁻³	$20.4 \cdot 10^{-3}$	37.7 · 10 ⁻³	$45 \cdot 10^{-3}$	48.4 · 10 ⁻³	$29.4 \cdot 10^{-3}$	35.3 · 10 ⁻³
Cores	144	96	144	240	96	240	96	144	144	192
C.I. ^b Simulation time [hh:mm]	63:47	254:50	91:13	110:10	41:43	134:18	18:17	419:47	154:15	113:37
C.I. Initial time step [s]	9.85 · 10 ⁻⁰⁵	7.74 · 10 ⁻⁰⁵	$5.78 \cdot 10^{-05}$	$6.68 \cdot 10^{-06}$	7.17.10 ⁻⁰⁵	$6.90 \cdot 10^{-05}$	$1.90 \cdot 10^{-04}$	5.51 . 10 ⁻⁰⁵	$1.35 \cdot 10^{-04}$	9.42 · 10 ⁻⁰⁵
T.I. ^c Simulation time [hh:mm]	81:25	167:52	335:12	340:18	336:33	53:50	265:20	213:53	17:20	120:46

TABLE 1 | Constant inflow simulations results and HPC information on both constant and transient inflow simulations.

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 $\Delta P_{diff} = \Delta P_{d} - \Delta P_{diff}$ of there are between detailed and smoothed pressure drops. $\Delta P_{diff} = \Delta P_{d} - \Delta P_{diff}$ of the control LV we calculated the PMs volume, since this LV geometry was only characterized by PMs. ^bC.I., Constant Inflow simulations. ^cT.I., Transient Inflow simulations. transient inflow simulations respectively. Vortex quantification was done in Paraview, by integrating the contours of the vortices to estimate the total surface area.

3. RESULTS

3.1. Constant Inflow

The results of constant inflow quantification for the five LVs are shown in **Table 1**. In all LVs, the intra-ventricular pressure drops (ΔP_{diff}) increased in the detailed geometries by an average 0.2 kPa, except for subject D, that elicited the highest ΔP_{diff} of 2.7 kPa. Also the detailed E LV, exhibited a similar pressure drop to models A, B, and C, regardless of the low percentage of trabecular volume within its geometry. The geometrical markers do not indicate a direct correlation to the pressure drop (see **Table 1**). The pressure drop in models A, B, C, and E correlated best with the distance between their inlet and outlet, however, when model D is included, any good correlation disappears. The pressure drop is not correlated either to the Reynolds number at the inlet of each model.

The magnitudes of the WSS for each case is shown in **Figure 7**. The WSS histograms are shown in **Figure 8**; they were cropped at 3 Pa for visualization purposes, but the maximum values are included in each plot. The median WSS decreased in the detailed geometries on all subjects, except for subject D, as shown in **Table 1**. Notice that in model D, in **Figure 7**, high WSS regions are markedly localized on the PMs and the outflow region. In model D the WSS median values remain relatively similar between the smoothed and detailed models, even though the mode values are significantly lower for the detailed geometry. It is important to point out that the peak WSS was higher on the detailed models in comparison with the smoothed geometries, except for model E.

The vortical structures shown in **Figure 9** are thresholded at 5,000 s⁻² and color coded according to the velocity magnitude [m/s]. The smoothed geometries generated fewer and larger vortices, while the detailed LVs showed the disruption of larger structures breaking down into a multitude of small scale vortices. To quantify them, the vortex contour surface area was calculated (shown in **Table 3**). The total surface area of the vortices was smaller in the smoothed (with a mean of $31.6 \pm 8.9 \cdot 10^{-3}$ m²).

3.2. E-A Wave Mitral Valve Inflow Results

From the E-A wave transmitral inflow function 6 time instants were selected, as highlighted in **Figure 4**: early E wave (1), E wave peak (2), late E wave (3), early A wave (4), A wave peak (5) and late A wave (6). **Figure 10** shows the vortices in model D. The Q-criterion values were thresholded at 1,000 s⁻² and colored according to the velocity magnitude [m/s]. **Figure 10** and **Table 3** show that the presence of trabeculae created secondary vortices at the early E wave (time instants 1), increasing the total vortex surface from $9.4 \cdot 10^{-3}$ m² in the smoothed to $14.8 \cdot 10^{-3}$ m² in the detailed geometry. The secondary vortices in the detailed LV penetrated deeper between the trabeculations during the late E wave (time instant 3). During the early and peak A wave, a second weaker vortex ring was formed and it mixed with the vortices

TABLE 2 | Constant inflow simulations results for A-D LVs with the porous layer of thickness $1.2 \cdot 10^{-2}$ m and porosity 20 kg/m², along with the corresponding HPC information.

Hearts	Α	В	С	D
ΔP [kPa]	1.5 ± 0.04	3.9 ± 0.4	0.78 ± 0.04	2.6 ± 0.3
WSS mode [Pa]	0.003	0.47	0.23	0.25
WSS median [Pa]	0.36	0.32	0.51	0.55
Total vortex surface [m ²]	36.8 ·10 ⁻³	$61.3 \cdot 10^{-3}$	40 ·10 ⁻³	54.6 ·10 ⁻³
Cores	144	144	96	96
Simulation time [hh:mm]	46:51	47:30	47:30	47:30
Initial time step [s]	$5.5 \cdot 10^{-05}$	$6.39 \cdot 10^{-06}$	7.68 ·10 ⁻⁰⁶	2.10^{-06}

P, mode of the pressure distribution at inlet and outlet.

 ΔP , intra-ventricular pressure drop from inlet to outlet.

 $\Delta P_{diff} = \Delta P_d - \Delta P_s$, differences between detailed and smoothed pressure drops.



generated during the early filling (time instants 4–5). Here, for both smoothed and detailed geometries, the total surface of the vortices increased due to the mixing vortices but the amount was still higher in the detailed compared to the smoothed LV $(25.5 - 22.5 \cdot 10^{-3} \text{ m}^2 \text{ vs. } 29.2 - 25.9 \cdot 10^{-3} \text{ m}^2 \text{ respectively}).$

3.3. Constant Inflow With a Porous Layer

The proposed porous layer produces energy dissipation, which increases the intra-ventricular pressure drop and adds complexity to the blood flow. The results of the sensitivity analysis of the effect on the intra-ventricular pressure drops for each thickness-porosity combination are reported in **Table 4**. By adding a layer of $1.2 \cdot 10^{-2}$ m thickness and a porosity of



20 kg/m² to the smoothed subject A, we obtained the intraventricular pressure drop equal to the one of its detailed case (1.5 kPa). Additionally, the vortex visualization using the Q-criterion thresholded at 5,000 s⁻² demonstrates that the amount of vortices in the smoothed LV with the porous layer are similar to the ones in the detailed case (see **Figure 3**), presenting a total vortex surface area of $36.8 \cdot 10^{-3}$ m². This may indicate that the roughness interacts with the boundary layer as a sand-grain roughness does, without prioritizing any particular flow direction, being then the proposed porous layer model very effective. The presence of the porous layer could also approximate the WSS calculated for the detailed geometry A as can be observed in **Table 2**, providing a relative error of only 0.076.

The same layer with a thickness of $1.2 \cdot 10^{-2}$ m and a porosity of 20 kg/m² was then applied to all the other cases (subjects B, C, D). In subject B and C, the presence of the porous layer increased the intra-ventricular pressure drop to values similar to the ones obtained within the detailed cases (see **Table 2**) providing a relative error of just 0.2 and 0.02 respectively. In subject D, the intra-ventricular pressure drop increased slightly with the presence of the porous layer, but in this case the thickness and porosity values of the porous layer were not able to reproduce the high values of pressure drop obtained inside the detailed model (relative error is 0.46). However, in all the models with the porous layer the WSS was reduced as shown in **Table 2** with the biggest relative error being 0.23 in model D. This table also shows how in all the cases the total vortex surface increased with the presence of the porous layer by providing values slightly higher than those of the detailed geometries in all cases, with the maximum relative error being -0.12 for model D.

4. DISCUSSION

LV endocardiums of humans present a highly trabeculated appearance, which is often ignored in ventricular hemodynamic studies. Even though a few studies have been done to analyze the effect of papillaries and trabeculae on blood flow, no study to our knowledge has ever included small trabeculae of cross-sectional area of 1 mm^2 .



In this study we focused on characterizing solely the effects of the geometries on the hemodynamics using CFD simulations. The fact that the walls are rigid makes it impossible to extapolate any of the findings to a clinical or physiologically relevant scenario. This study provides an engineering-like approach to a very complex biological system, by quantifying and characterizing the interaction between endocardial structures and blood flow and providing a potential model to include the effect of the complex structures within the heart without the need of segmenting an extremely complex structure and running large simulations every time. Therefore the absence of the mitral valve may constitute a limitation if we were drawing physiological conclusions, however it is not the case for the kind of study presented in this manuscript.

Given the different metrics analyzed, there appears to be no direct correlation between the volume of trabeculae and the intra-ventricular pressure drop. For the geometrical markers, subject D, for example, presented the highest ΔP_{diff} and is characterized by the smallest angle between the valvular planes (43.3°). We hypothesize that the ΔP_{diff} obtained in model D is a result of the location of the PMs, which were positioned right below the inlet, disturbing the blood flow at the inlet, which led to a higher energy dissipation, not observable in the other cases. There is no direct correlation between the angle or distance of inlet and outlet and the ΔP_{diff} . It is clear that the existence of rugosities along the endocardial walls alter the hemodynamics by creating flow recirculation regions, vortex disruption into secondary vortices, which increase the energy dissipation, hence increasing the intra-ventricular pressure drop in complex ways. A key observation is that the location and orientation of the mitral and aortic valvular rings influence the direction of the flow, and hence, the high WSS visible either on trabeculated regions or on the PMs. We hypothesize that

this observation is responsible for the high maximum WSS magnitude on the detailed geometries. Given the surface area of trabeculae or papillaries, WSS tends to be concentrated in small regions (Figure 7), increasing its maximum magnitude. This fact may have high implications on local tissue remodeling. However, regardless of the range of WSS, in Figure 8 it can be observed that in the smoothed geometries the mode WSS was of 0.5-1 Pa, while in detailed meshes the mode drops to approximately 0 Pa. PMs and trabeculae reduced the WSS in LV about 23.5-66.7%. Wall shear stress is an important parameter in biology in general. Mechano-transduction is an important mechanism in biology. Even though it is practically impossible to measure it in-vivo in the LV, and it has never been reported before, the fact that WSS is reduced in the presence of trabeculae may provide an insight of the reason of why such endocardial structures exist. The presence of trabeculae and PMs generated a multitude of secondary vortices that were not present in the smoothed geometries, as shown in Figure 9. The overall vortex area decreased in the smoothed LVs (Table 1), with a mean of $31.6 \pm 8.9 \cdot 10^{-3}$ m². The presence of detailed endocardial structures increased the amount of vortices with a mean area of $43.5 \pm 10.8 \cdot 10^{-3}$ m². Subject D was intriguing. The effect of trabeculae and PMs led to a higher WSS median. This is because this LV is characterized by large PMs (noticeable in Figures 1, 8), which led to higher WSS concentrated on the PMs. A 4.8% higher WSS was indeed observed in the detailed D case. We hypothesize that the high pressure drop in case D was due to the prominent PMs, which disturbed flow markedly, increasing the energy dissipation within the intra-ventricular volume, and thus, generating a high intra-ventricular pressure drop (see Figure S3). The analysis of more geometries is required to further understand and characterize the effect of endocardial structures on hemodynamics.



endocardial surfaces along with the control LV (E)

The results from the control subject E demonstrated that the presence of only the PMs led to a low ΔP_{diff} (0.2 kPa), however the main impact appears to be the WSS distributions in comparison with the more detailed geometries. In other words, having only PMs and a few big trabeculae does not significantly modify the WSS.

Using a transient inflows (E-A wave) allowed the study of vortex formations following physiological inputs. In the smoothed LV vortices were nominal and the generation of the vortex rings was clearly visible during the E waves (see the example in **Figure 10**). On the other hand, in the trabeculated ventricles, the vortex rings were disrupted, generating a multitude of secondary vortices. The vortex surface areas are provided in **Table 3**. It can be observed that the total surface areas of the vortices were larger in the trabeculated, in comparison to the smoothed geometry. Furthermore, in the anatomically detailed LV the secondary vortices penetrated deeper between the trabeculations during the late E wave (time instant 3). Notice that the A wave seems to produce higher vorticity in this model. We hypothesize that the reason for this is that we are starting our simulation with an organized zero flow all throughout the model. Recirculation within the cavity at zero flow (diastasis) would create higher vorticity in the second inflow wave. In the smoothed case vortices were more compact, while in the anatomically detailed LV there were multiple vortices that tended to be pushed toward the apex during the late A wave (time instant 6). This finding is in accordance with the results from the work of Vedula et al. (2016), in which the authors suggests that the observed behavior may help increasing LV washout. On the other side, the main vortex ring disruption and secondary vortices formation due to LV trabeculations was not seen in the work of Lantz et al. (2016), where they noticed that the presence of PMs and trabeculae generates a large vortex in the middle of the LV cavity.

Preliminary results from replacing the trabeculae with a porous layer show that it is possible to obtain an intra-ventricular pressure drop similar to those generated by the detailed endocardial models. Only for subject D, the intra-ventricular



TABLE 3 | Total vortex surface $[m^2]$ for the six instants (1-6) of the synthetic E-A wave in subject D.

Geometry	1	2	3	4	5	6
Smoothed	9.4 · 10 ⁻³	16.7 · 10 ⁻³	17.4 · 10 ⁻³	25.5 · 10 ⁻³	22.5 · 10 ⁻³	23.7 · 10 ⁻³
Detailed	$14.9 \cdot 10^{-3}$	$18.1 \cdot 10^{-3}$	$24.4 \cdot 10^{-3}$	$29.2 \cdot 10^{-3}$	$25.9 \cdot 10^{-3}$	$26.6 \cdot 10^{-3}$

pressure drop was not as high as the one observed in the detailed model. This is due to the presence of big PMs right below the mitral valve inlet, which, as explained previously, highly disturbed the flow and increased the energy dissipation.

Moreover, the addition of a porous layer on the smoothed geometries helped to reduce the WSS median in all the models providing small relative errors 0.07, 0.05, 0.23, and 0.16 respectively. Again, for model D, the median WSS had a bigger relative error mostly due to the large impinging of flow on the PMs, which increase the WSS median for that specific case. Finally, the presence of the porous layer disrupted the main vortices into smaller ones, increasing the total vortex surface to values slightly higher than the observed in the detailed cases, however, the relative errors range from -0.1 to -0.12, therefore reproducing the hemodynamic behavior in terms of vorticity.

4.1. Limitations

The main limitation of this study is the use of CFD, without fluid-structure interaction (FSI), valves or moving walls. The lack of motion prevents us from comparing any measured value to *in-vivo* heart function, however, as was mentioned before, this study attempts to characterize solely the geometry effects on

hemodynamics. Future work involves the use of FSI to compare our findings to *in-vivo* measurements. Another limitation is the small sample size, which limits the generalization and statistical significance of our results.

The generation of smoothed ventricles from the trabeculated ones provides a degree of variability in the geometries created. We removed the trabeculae keeping the overall shape of the ventricle and the volume unchanged. This however is observer dependent and requires a fair amount of user interaction. In models A–D, the smoothing procedure led to slightly smaller estimated LV volumes due to the elimination of the trabeculae. In the case of model E, the ventricular surface was primarily characterized by PMs, presenting just a few trabeculae, which led to a larger volume in the smoothed heart.

An important limitation is that valves were not considered in our simulations. The presence of the mitral valve will direct the blood flow jet to create impinging and this will have some influence on the interaction between the flow and the detailed endocardial structures. The valves have also been reported to create a vortex ring right below its leaflets, as observed in previous studies (Töger et al., 2012; Vedula et al., 2016), which is impossible to capture in this study.



TABLE 4	Porous layer sensitivity analysis results for	subject A.
		0000171.

Geometry				Porou	s layer				
Porous layer thickness [m]		1.10 ⁻²				1.2 · 10 ⁻²			
Porosity [kg/m ²]	7	20	40	70	7	20	40	70	
ΔP [kPa]	1.46	1.45	1.45	1.44	1.56	1.5	1.47	1.45	
WSS median [Pa]	1.3	1.26	1.11	1.1	1.27	1.32	1.2	1.18	
Total vortex surface [m ²]	$38.5 \cdot 10^{-3}$	$36.4 \cdot 10^{-3}$	$32 \cdot 10^{-3}$	$31.4 \cdot 10^{-3}$	$36.3 \cdot 10^{-3}$	$36.8\cdot10^{-3}$	$35.7 \cdot 10^{-3}$	$32.9 \cdot 10^{-3}$	

Constant inflow simulations.

5. CONCLUSIONS

The highly anatomically detailed LV models developed in this study present a level of geometric information that was never achieved before. The simulations performed highlight the differences between blood flow CFD simulations in detailed vs. smoothed human ventricular models. The presence of detailed structures increase the intra-ventricular pressure drop, create multiple secondary vortices and decrease the WSS within the LV cavity. The amount of trabeculations have no direct correlation with the ΔP_{diff} , which was noted highest in the female LV D case. To the best of our knowledge, our study analyzed for the first time intra-ventricular pressure drops to investigate the effects of trabeculae and PMs on LV hemodynamic modeling. LV hemodynamics in detailed geometries are more complex than we anticipated, hence, a detailed study with more subjects is necessary and ongoing. Furthermore, our results confirm that neglecting detailed endocardial structures prevent computational models from recreating the complex blood flow behavior within the ventricles. Given that HPC simulations and high resolution MRI data are not always accessible, we propose that a simulated porous layer on the endocardial wall of smoothed LV models can potentially substitute the highly detailed geometries. Finally, we demonstrated that by adding a layer of $1.2 \cdot 10^{-2}$ m thickness and 20 kg/m² porosity to the smoothed cases we obtained pressure drops and WSS similar to the ones in the detailed LVs. The porous layer also increased the amount of secondary vortices, close to the amount observed inside the trabeculated models.

6. RESOURCE IDENTIFICATION INITIATIVE

Atlas of Human Cardiac Anatomy, RRID:SCR_015734.

MareNostrum Supercomputer, BSC, Barcelona, RRID:SCR_015737. ARCHER, UK National Supercomputing Service, RRID:SRC 015854.

Fiji, RRID:SCR_002285.

Seg3D, RRID:SCR_002552.

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ReMESH, RRID:SCR_015735. ITK-SNAP Medical Image Segmentation Tool, RRID:SCR_002010. Autodesk Meshmixer, RRID:SCR_015736. Paraview, RRID:SCR_002516.

AUTHOR CONTRIBUTIONS

FS: Conception, drafting, data analysis and interpretation of data. BP: Data preprocessing, data analysis. TI, PI: Acquisition of data and critical revision. CB, JA-S: Conception, drafting, analysis, critical revision. MV, GH, OL: Implementation of the solvers, critical revision.

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SUPPLEMENTARY MATERIAL

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