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A Mathematical Model for the Cardiac Function

Alfio Quarteroni

MOX, Politecnico di Milano
Milan, Italy
& EPFL, Lausanne, Switzerland
(professor emeritus)



POLITECNICO
MILANO 1863

EPFL



POLITECNICO
MILANO 1863



Acknowledgments

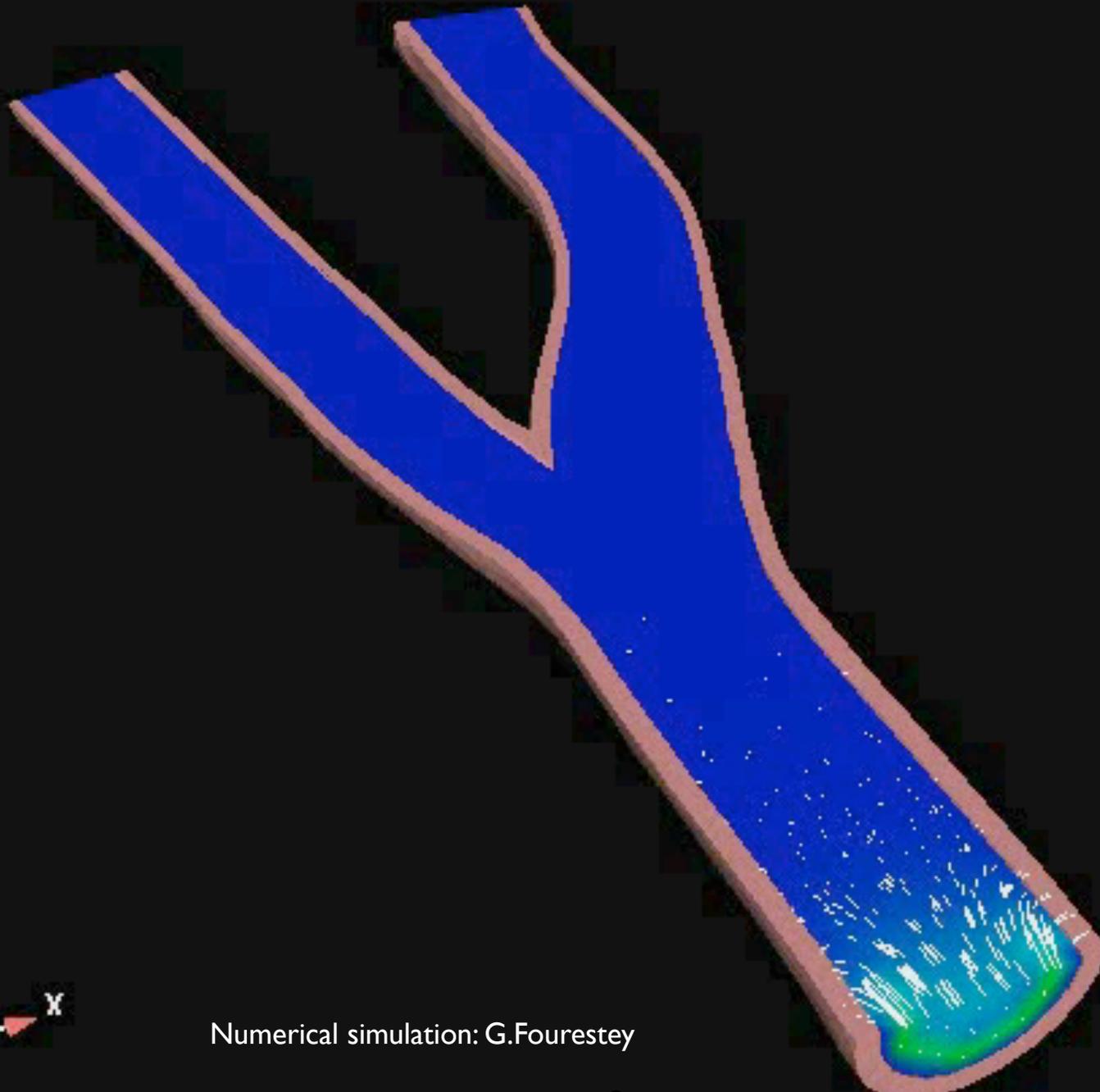
S.Deparis, F.Menghini
(EPFL - Lausanne)

**P.Zunino, C.Vergara, L.Dede', A.Manzoni,
M.Fedele, S.Pagani, I.Fumagalli, P.Africa
F.Regazzoni, S.Di Gregorio, R.Piersanti, A.Zingaro**
(Politecnico di Milano)

R. Ruiz Baier
(U Oxford)

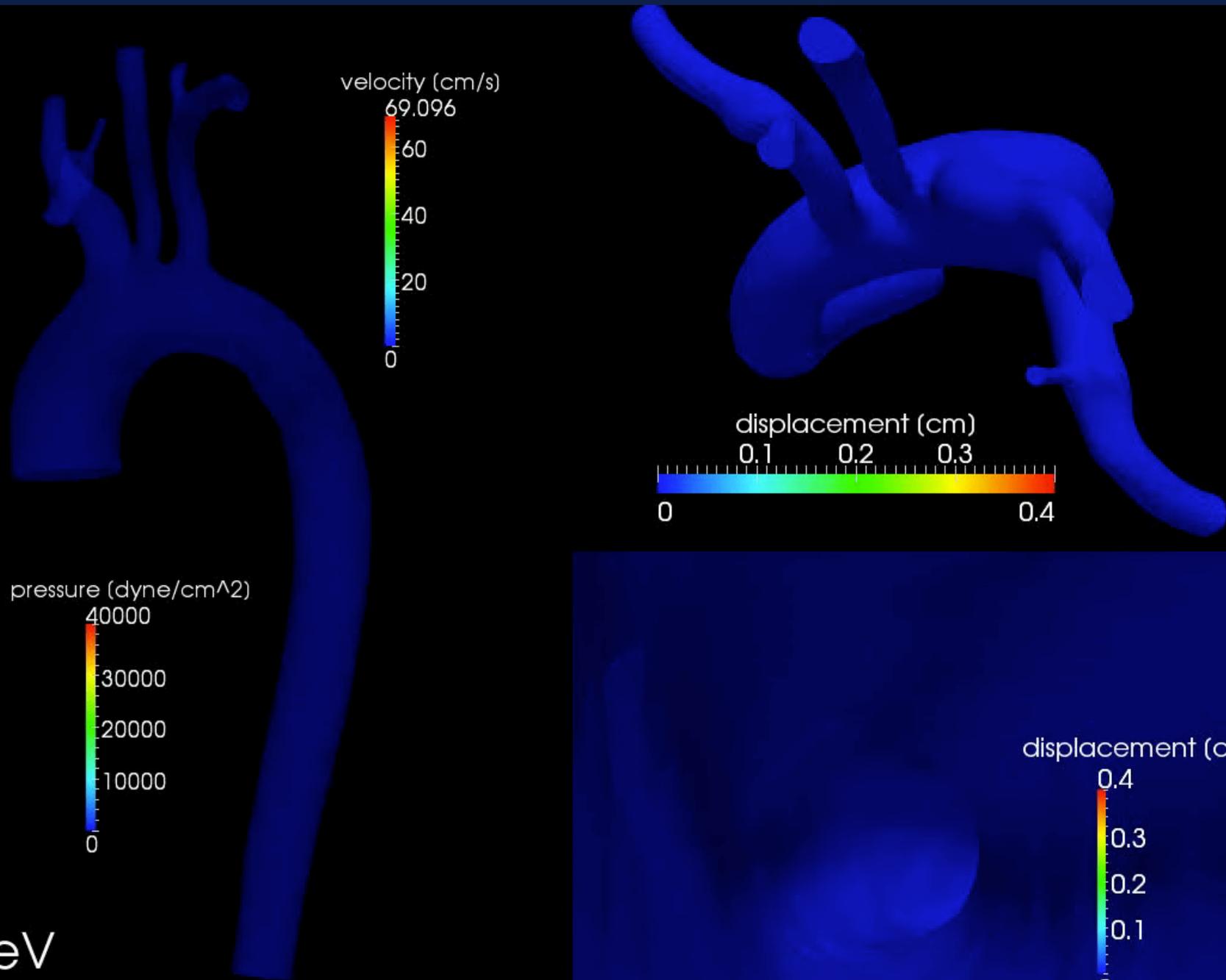
S. Rossi
(U North Carolina)

Local flow analysis past carotid bifurcation

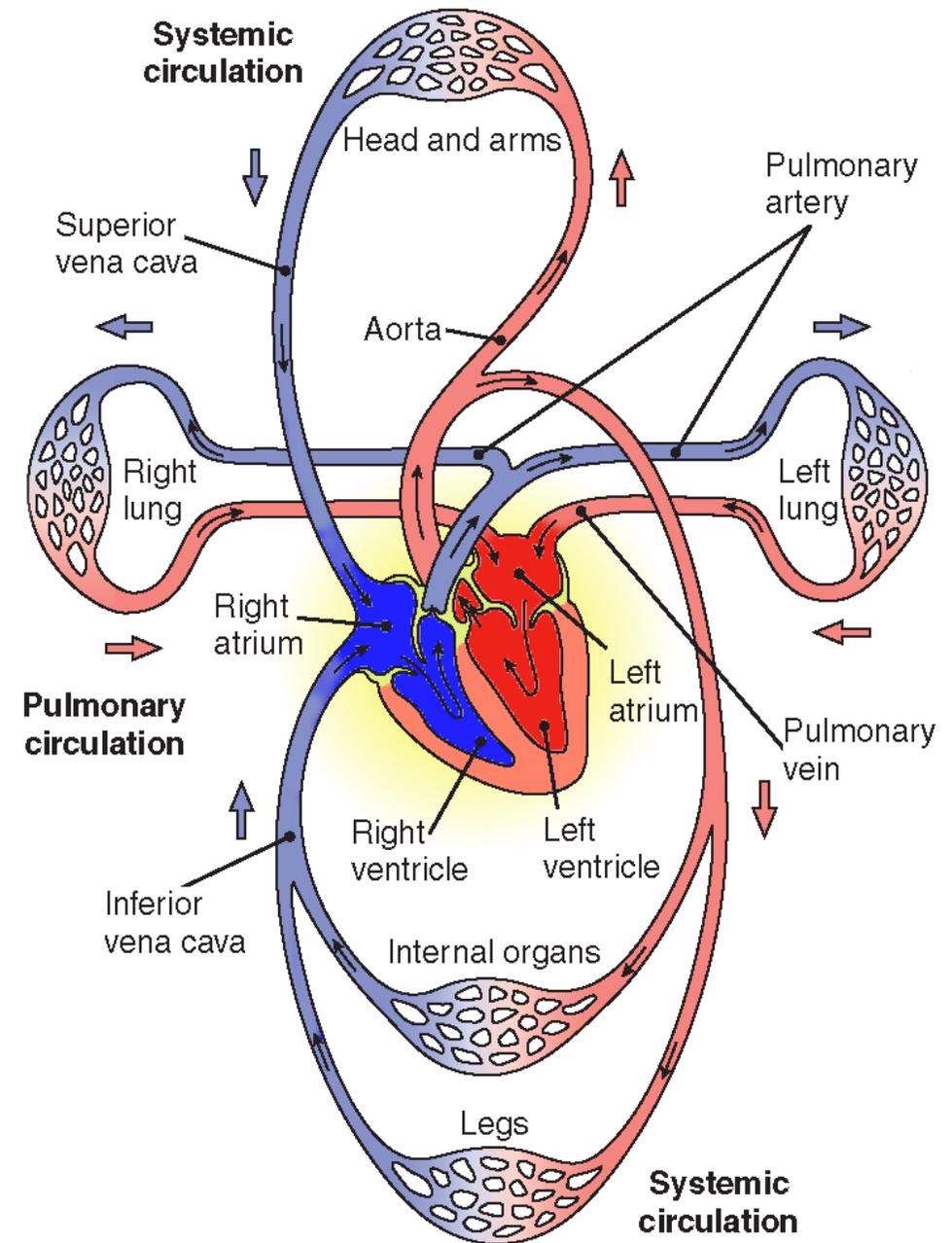
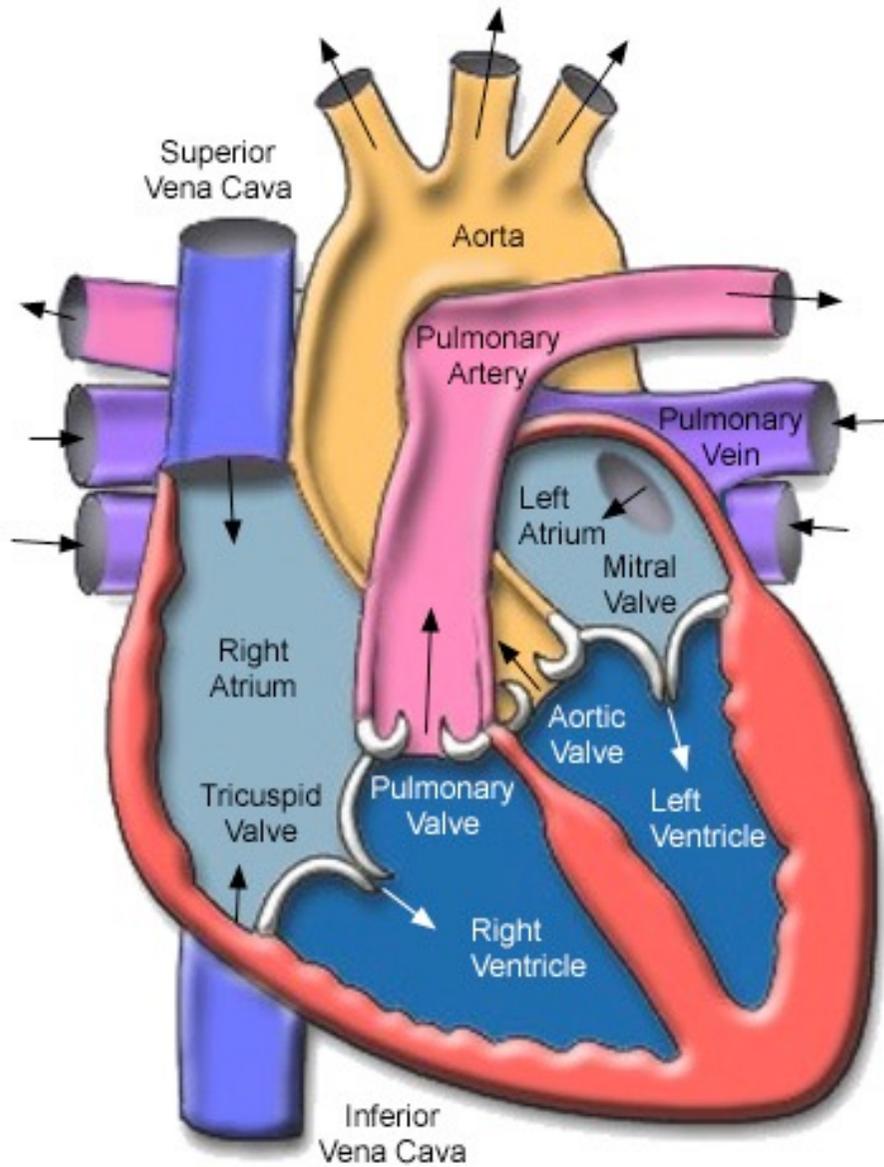


Numerical simulation: G.Fourestey

Thoracic and abdominal aorta fluid-structure simulation



The Heart and the Circulation



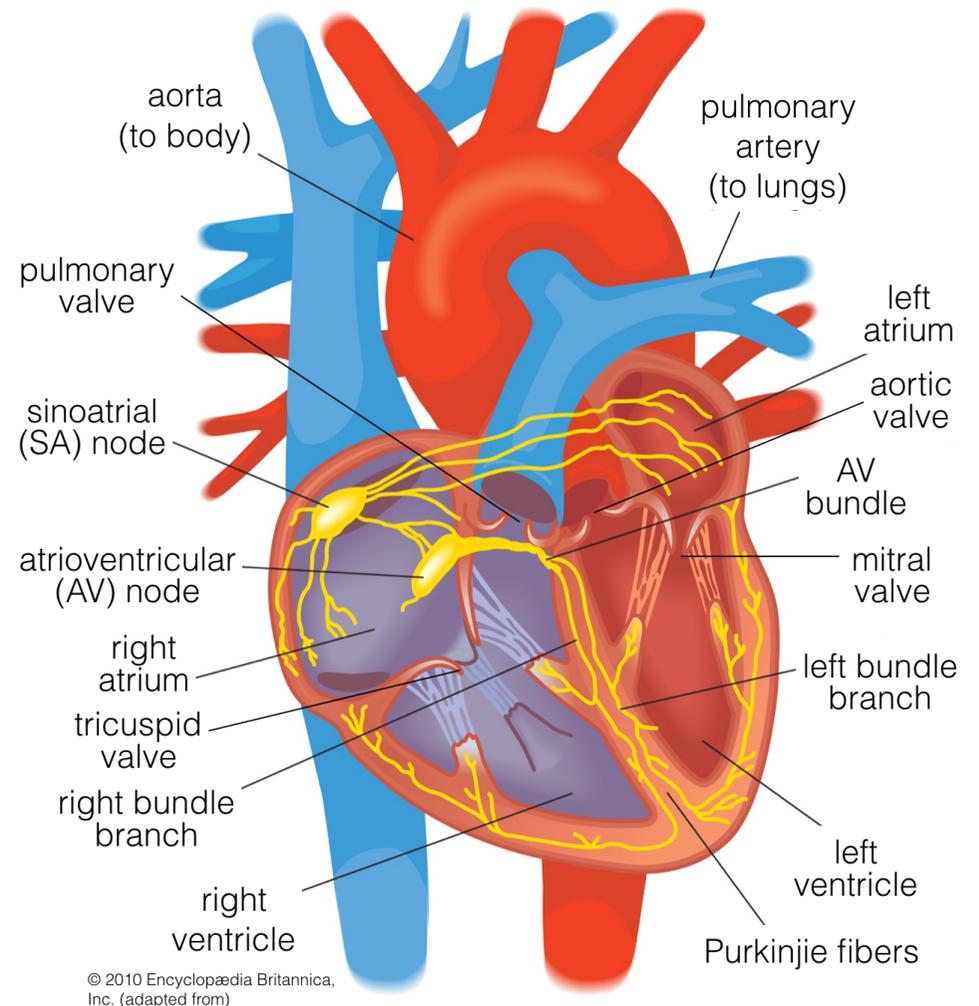
Cardiac anatomy



Cardiac Electrical Activity

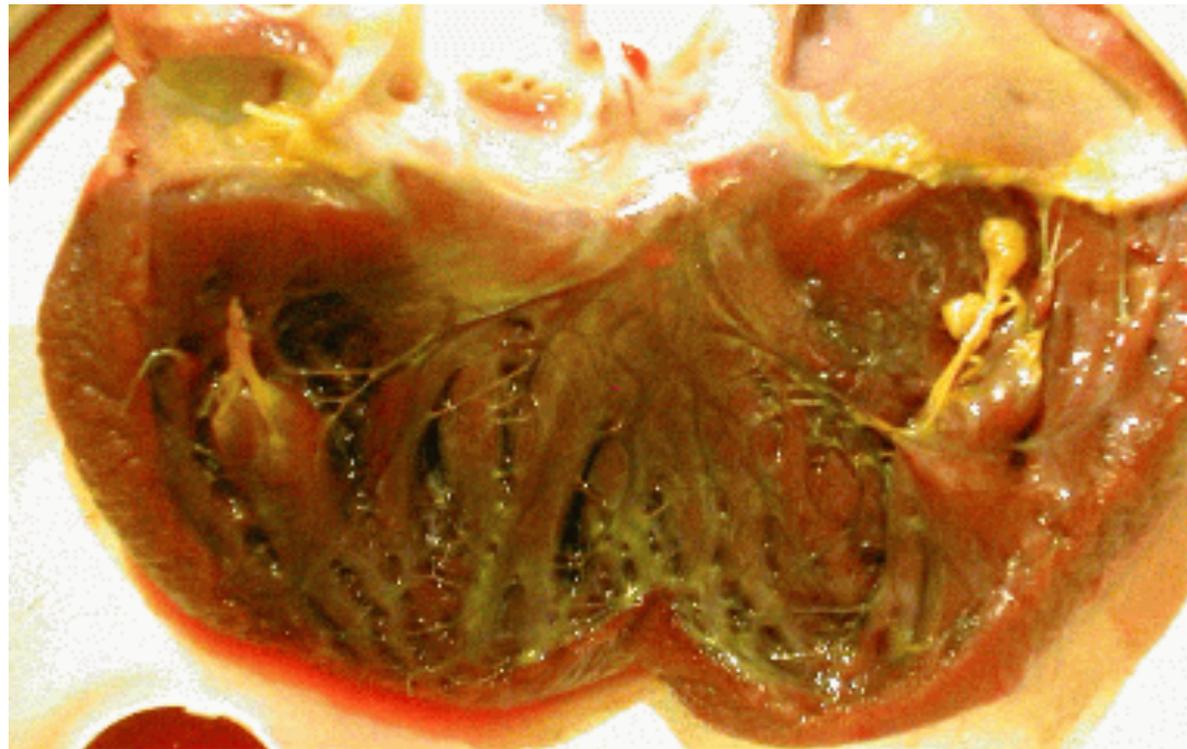
Each heartbeat is triggered by an electrical signal, originating at the **sinoatrial node**, a natural pacemaker consisting of **a cluster of self-excitabile cells** and located on the upper part of the RA. The electrical signal propagates from cell to cell through the two atria and it reaches the **atrioventricular node**, located between the atria and the ventricles.

The purpose of the atrioventricular node is acting as a **filter between the atria and the ventricles** in order to ensure the correct delay between the contraction of the former and the latter. This is crucial to guarantee that **the ventricle contraction starts only when the blood has been pumped by the atria into the ventricle themselves**.



Cardiac Electrical Activity

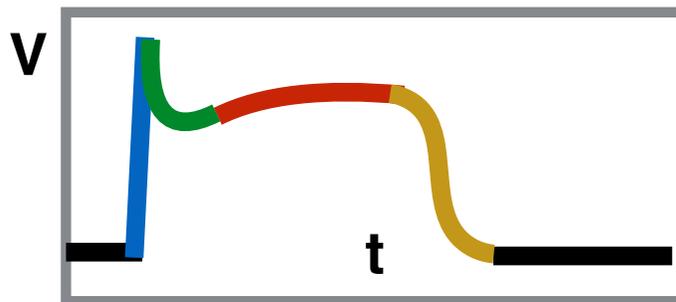
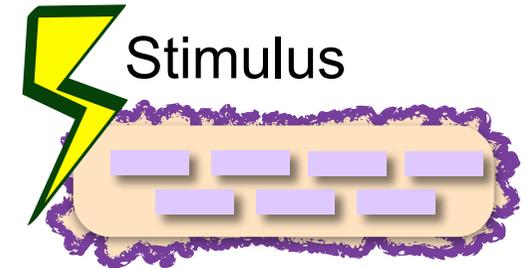
The electrical signal travels from the atrioventricular node through a system of specialized conducting fibers, the so-called **Purkinje network**, and it reaches the ventricles wall. Then, similarly to what happens in the atria, it travels from cell to cell through the **gap junctions**.



Heart apex

Action Potential

Cardiomyocytes, the cardiac muscle cells, are excitable: when stimulated by the application of an electrical stimulus, the chemo-electric equilibrium of the cell membrane is broken, thus originating a sequence of events that make the electric potential of the cell rise and then fall. Such phenomenon, known as **action potential**, is due to the opening and closing of voltage-gated **ion channels**. The resulting **flux of ions** across the cell membrane makes the **transmembrane potential** vary.



Action potential

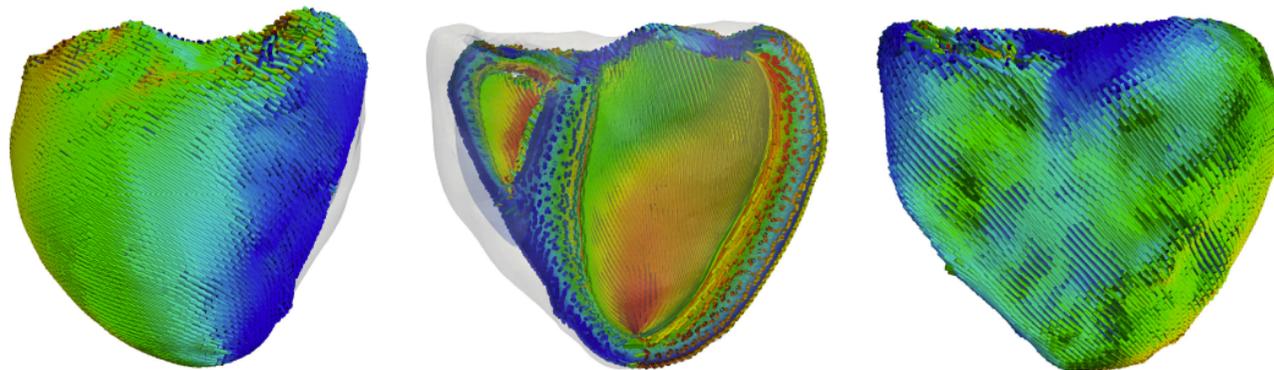
- 1) **Depolarization**
- 2) **Early repolarization**
- 3) **Plateau**
- 4) **Repolarization**

Calcium ions induce a complex chain of reactions with the final outcome of the generation of **active force** inside the cardiomyocytes. Finally, the contractile force generated at the microscale causes the **macroscopic contraction** of the heart chambers.

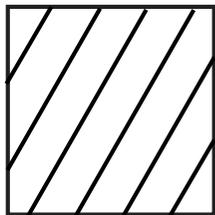
Cardiac Mechanics

To characterize both its **active** and **passive** behavior the tissue is typically modeled (defined) as an **orthotropic material**, in particular by accounting for the presence of **muscle fibers** and **collagen sheets**.

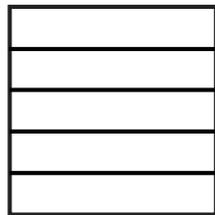
The **Holzappel-Ogden** constitutive law is used, together with the **active strain** or **active stress** approach for the activation



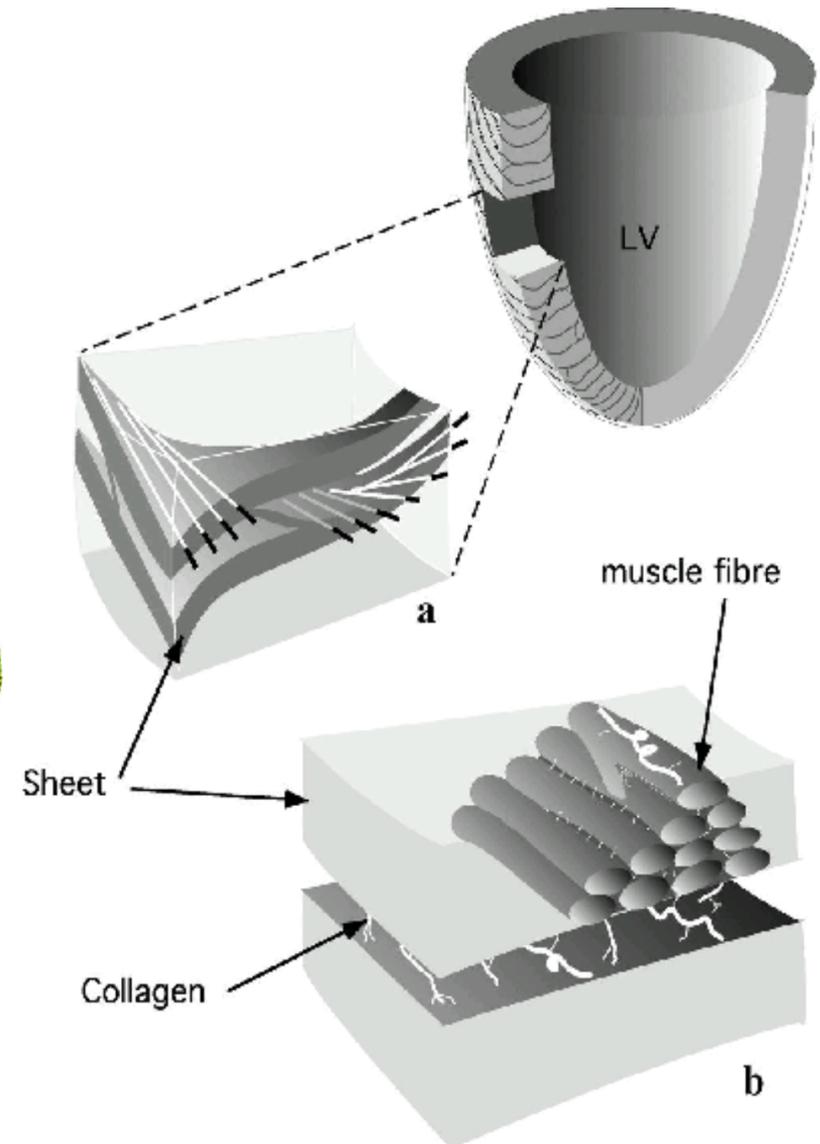
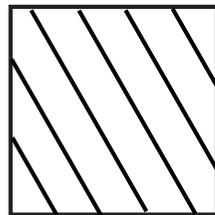
fibers



at endocardium

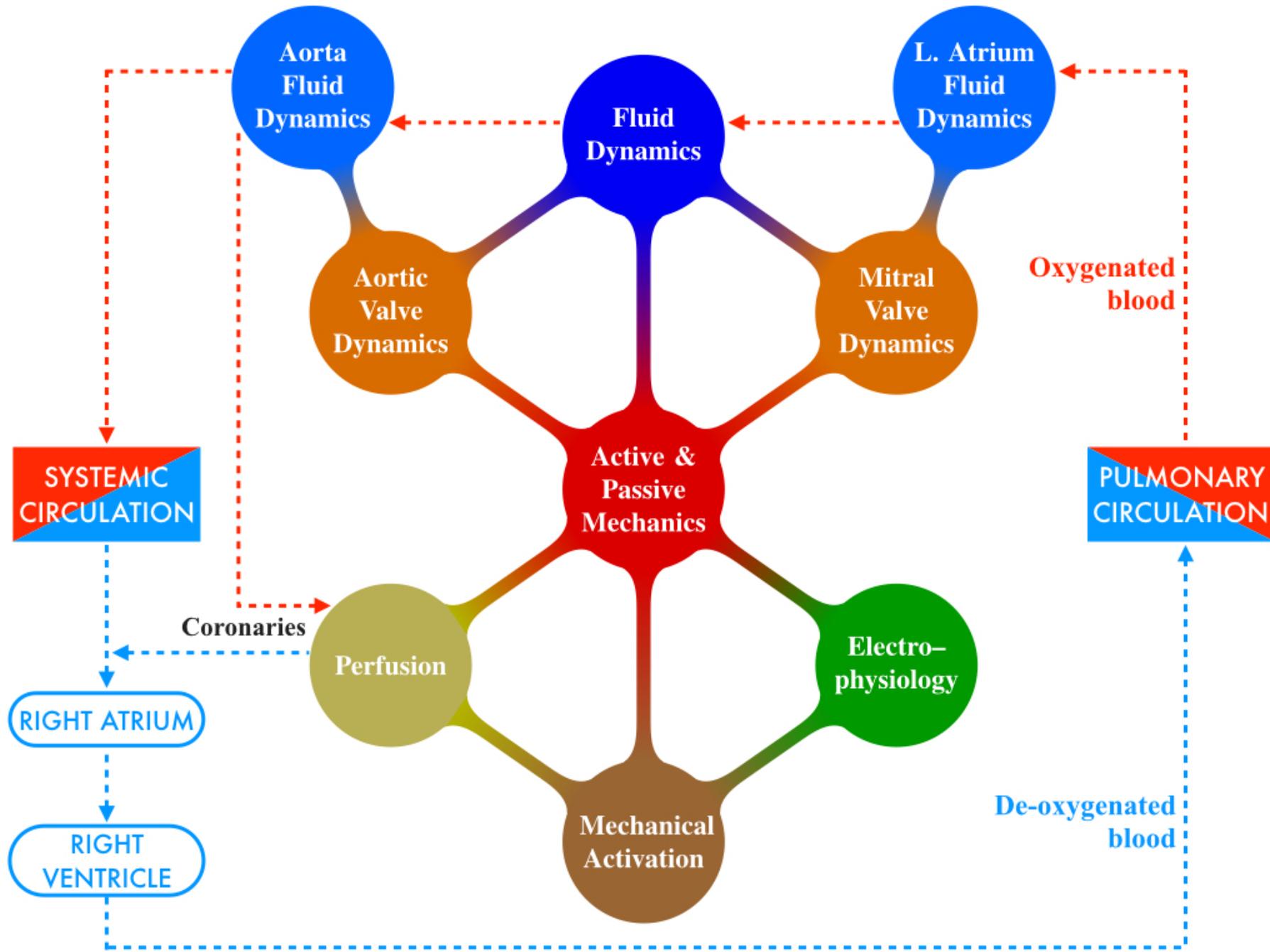


at epicardium

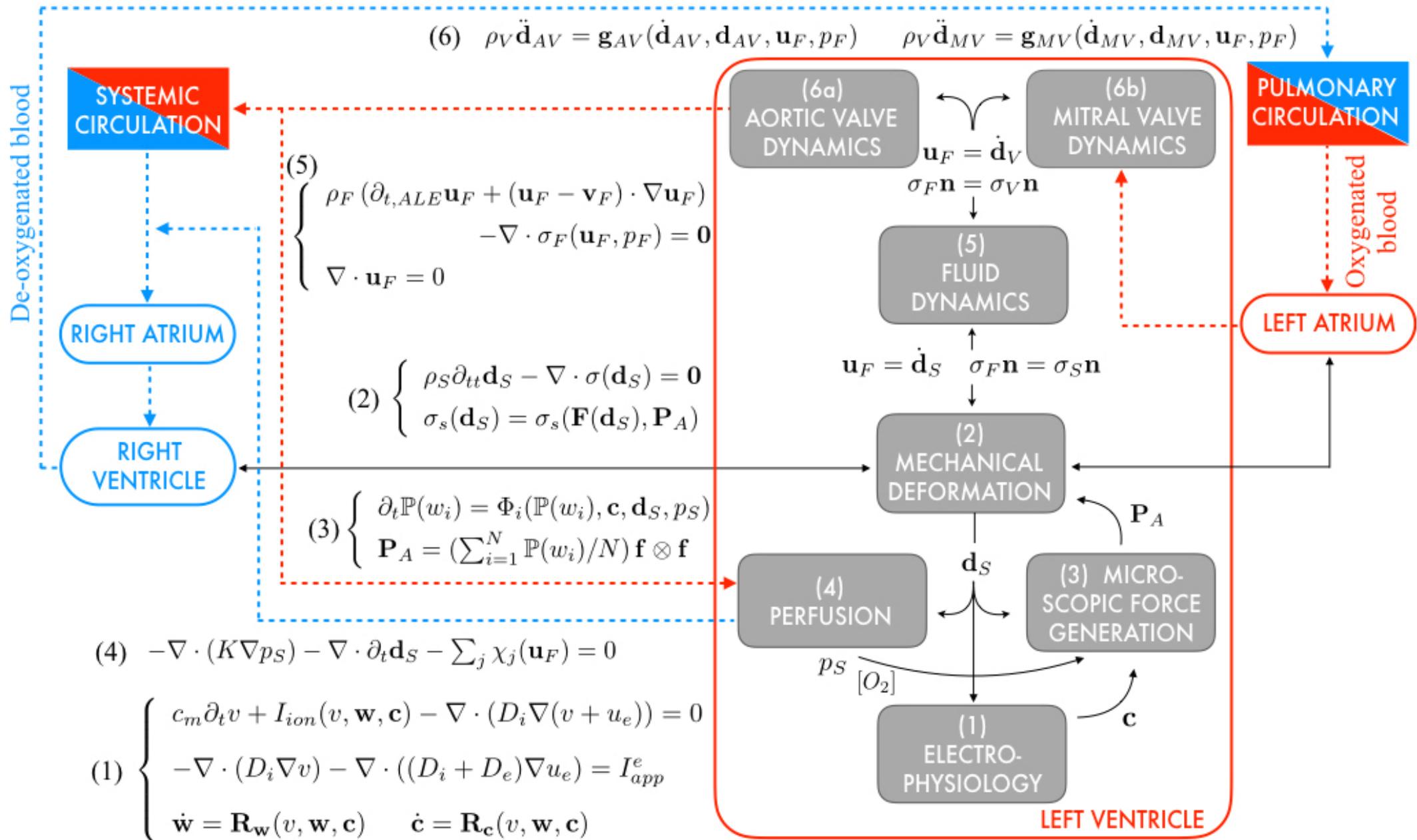


[LeGrice et al. 1995]

Core Cardiac Models

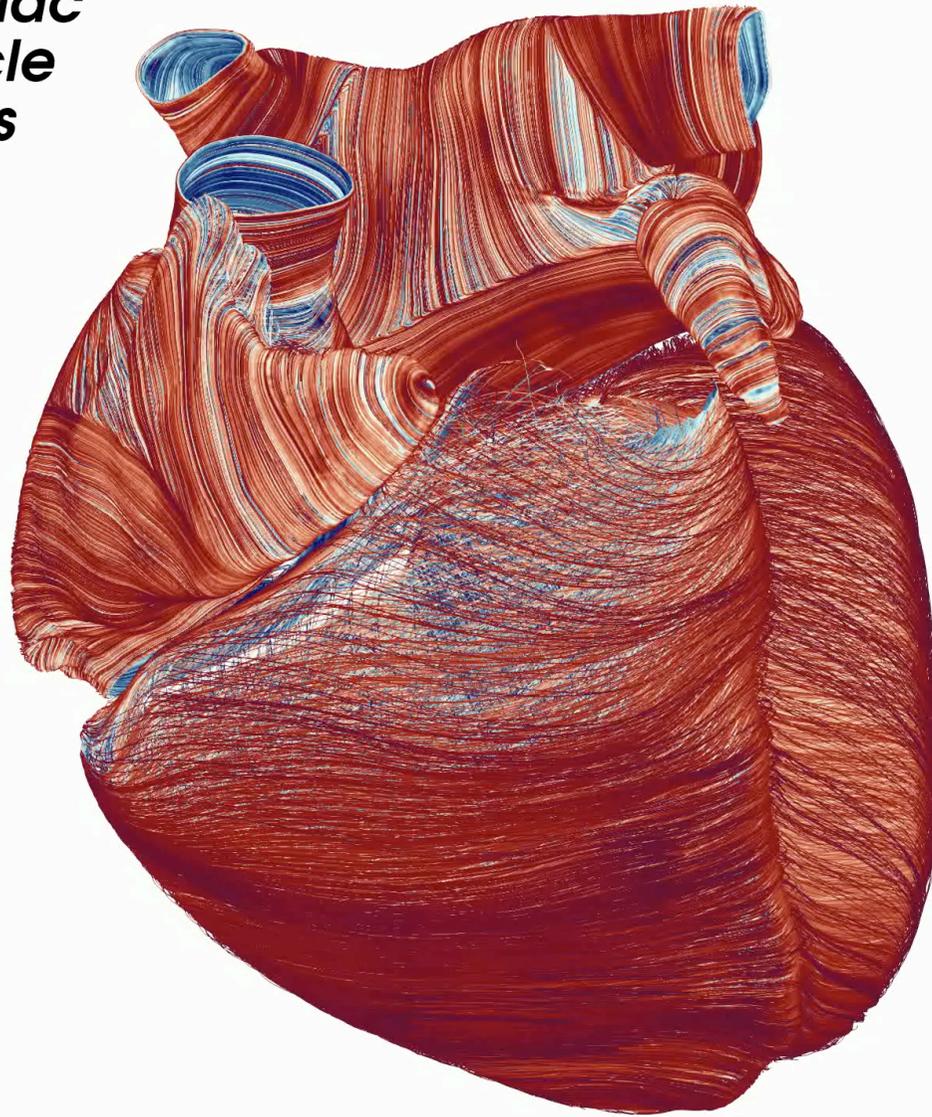


The Mathematical Heart



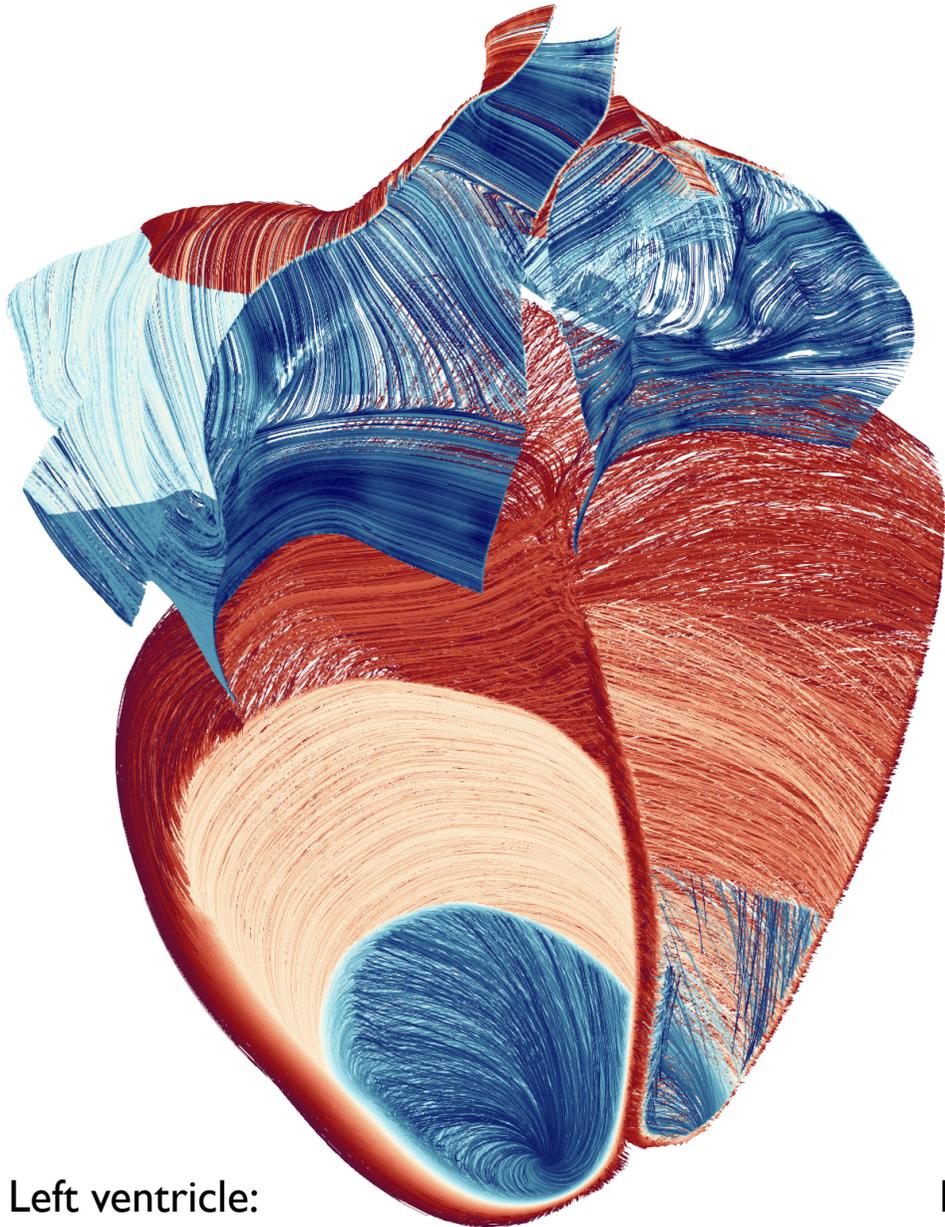
Cardiac Muscle Fibers

EPI
Transmural depth
ENDO



(R.Piersanti)

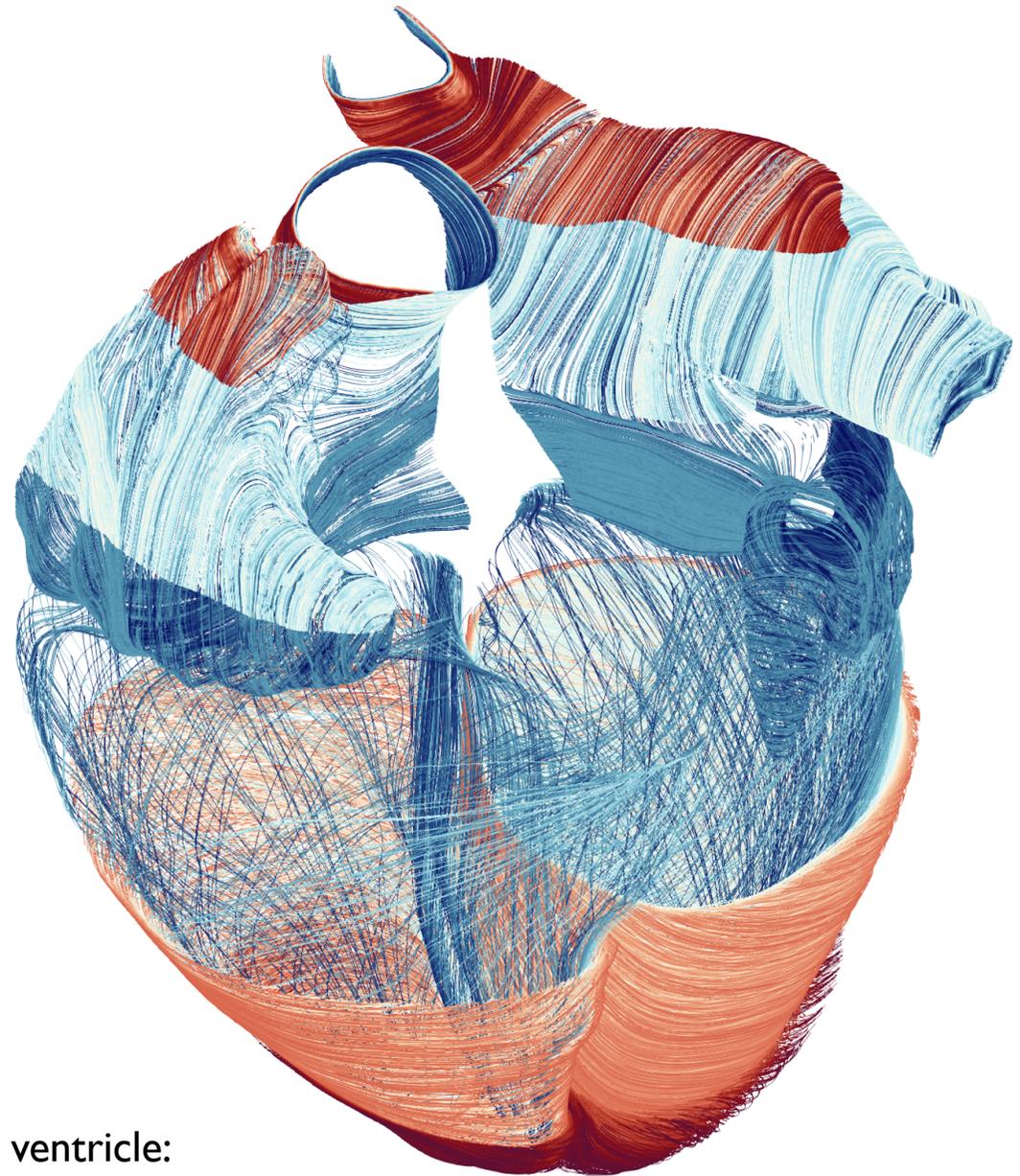
Longitudinal Section (left), Cross Section (right)



Left ventricle:

Fibers: $\alpha_{\text{endo}} = +60^\circ$ $\alpha_{\text{epi}} = -60^\circ$

Sheets: $\beta_{\text{endo}} = +20^\circ$ $\beta_{\text{epi}} = -20^\circ$

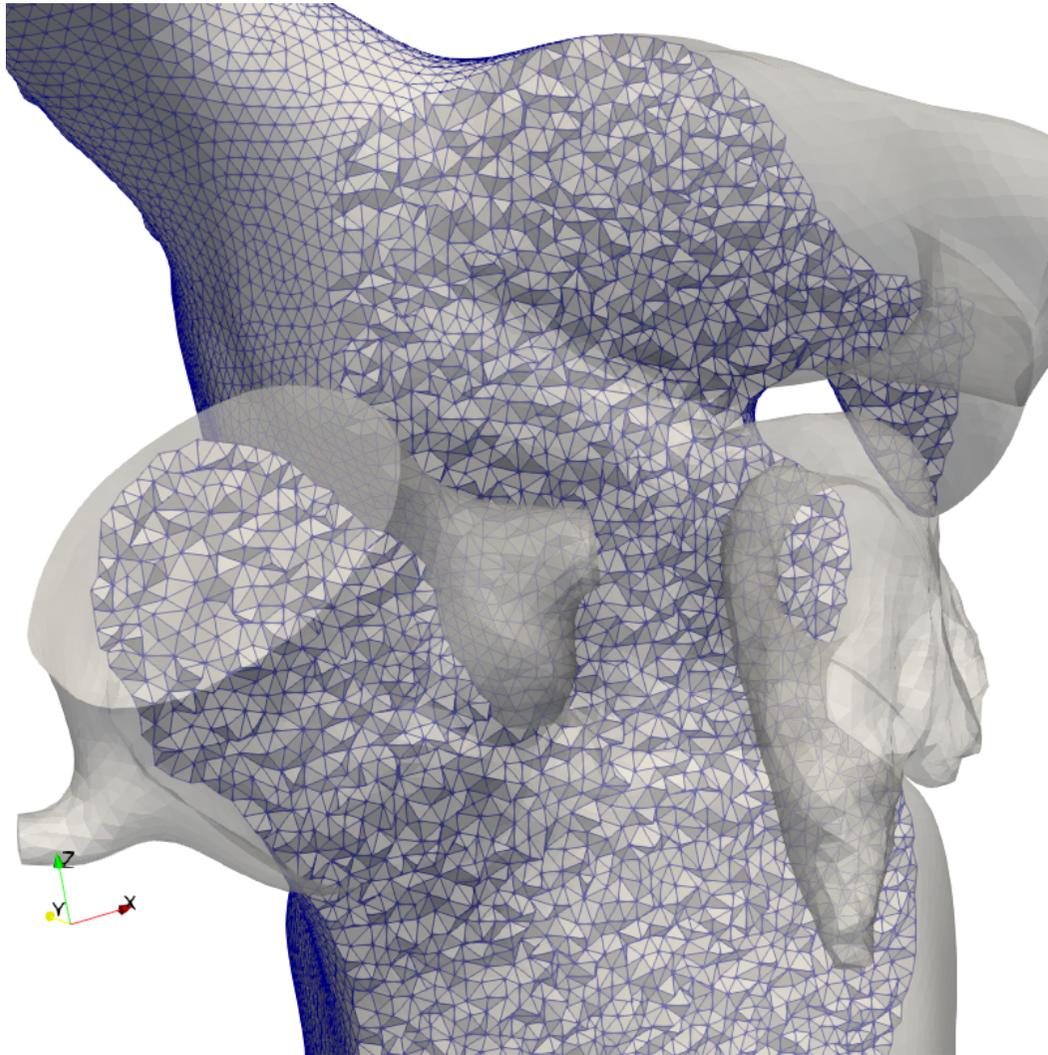


Right ventricle:

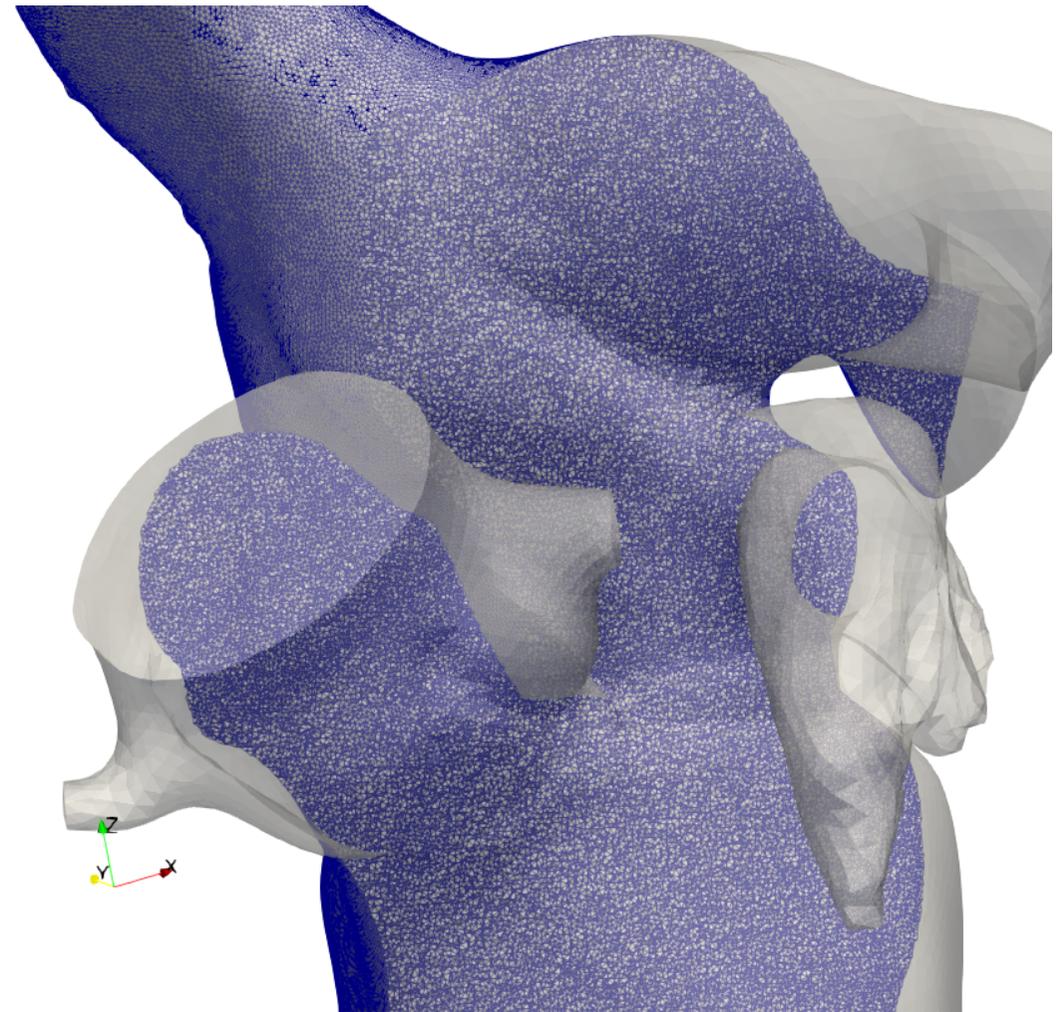
Fibers: $\alpha_{\text{endo}} = +90^\circ$ $\alpha_{\text{epi}} = 0^\circ$

Sheets: $\beta_{\text{endo}} = +20^\circ$ $\beta_{\text{epi}} = -25^\circ$

Computational mesh with different resolution



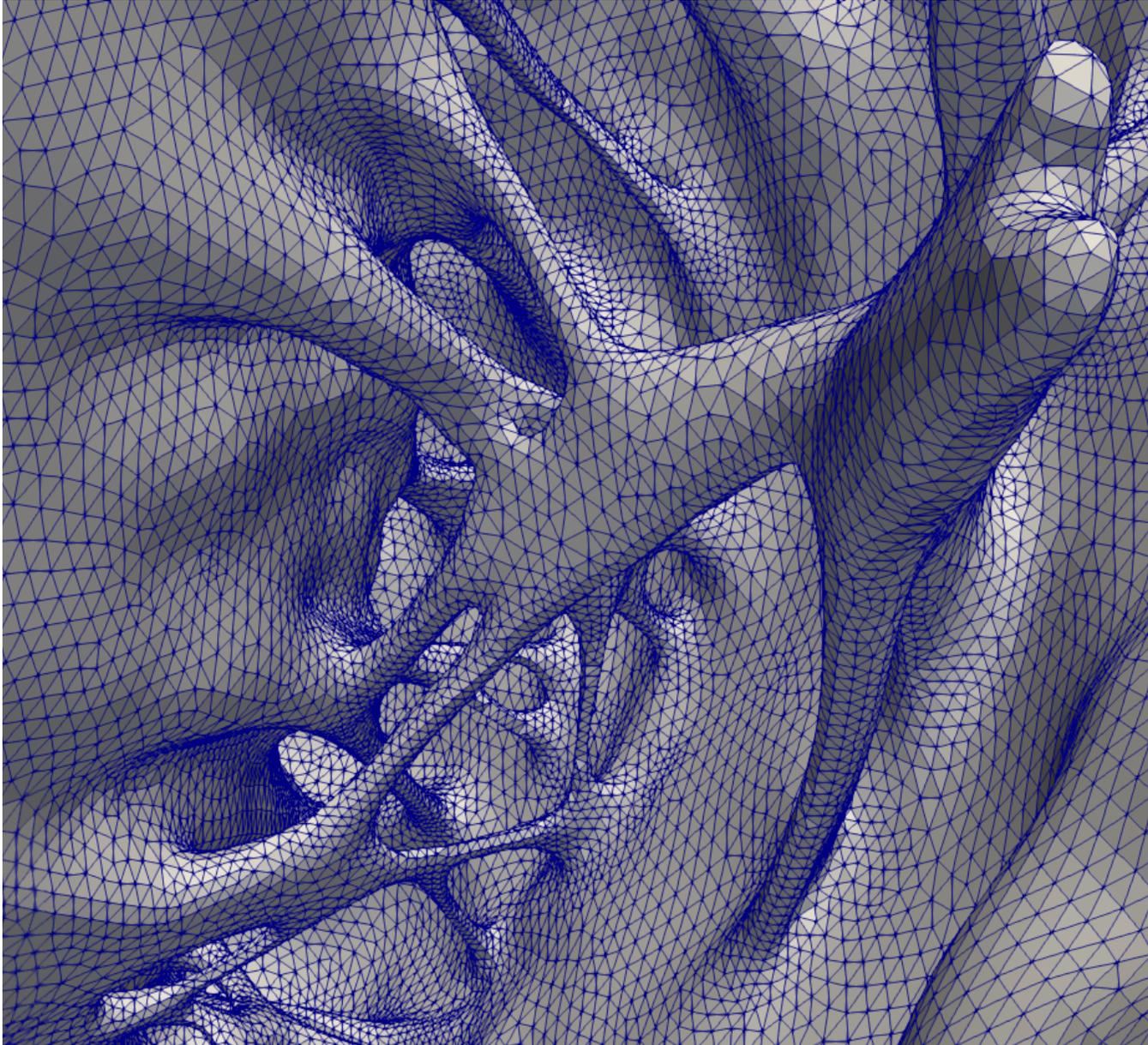
800.000 Elements



22.000.000 Elements

Finer meshes involve higher computational resources, however they allow a more accurate numerical solutions

Details matter



Mesh for papillary muscles and trabeculae carneae in the right ventricle (M.Fedele)

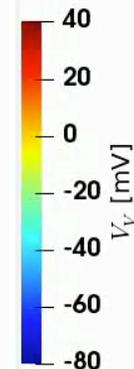
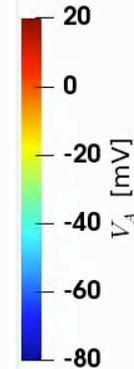
Electric Wave Propagation in the Whole Heart (R.Piersanti)

Time=0 corresponds to the onset on the initial electric stimulus at sino-atrial node (right atrium)

Electrical wave propagation in the heart



Bueno-Orovio ionic model for ventricles



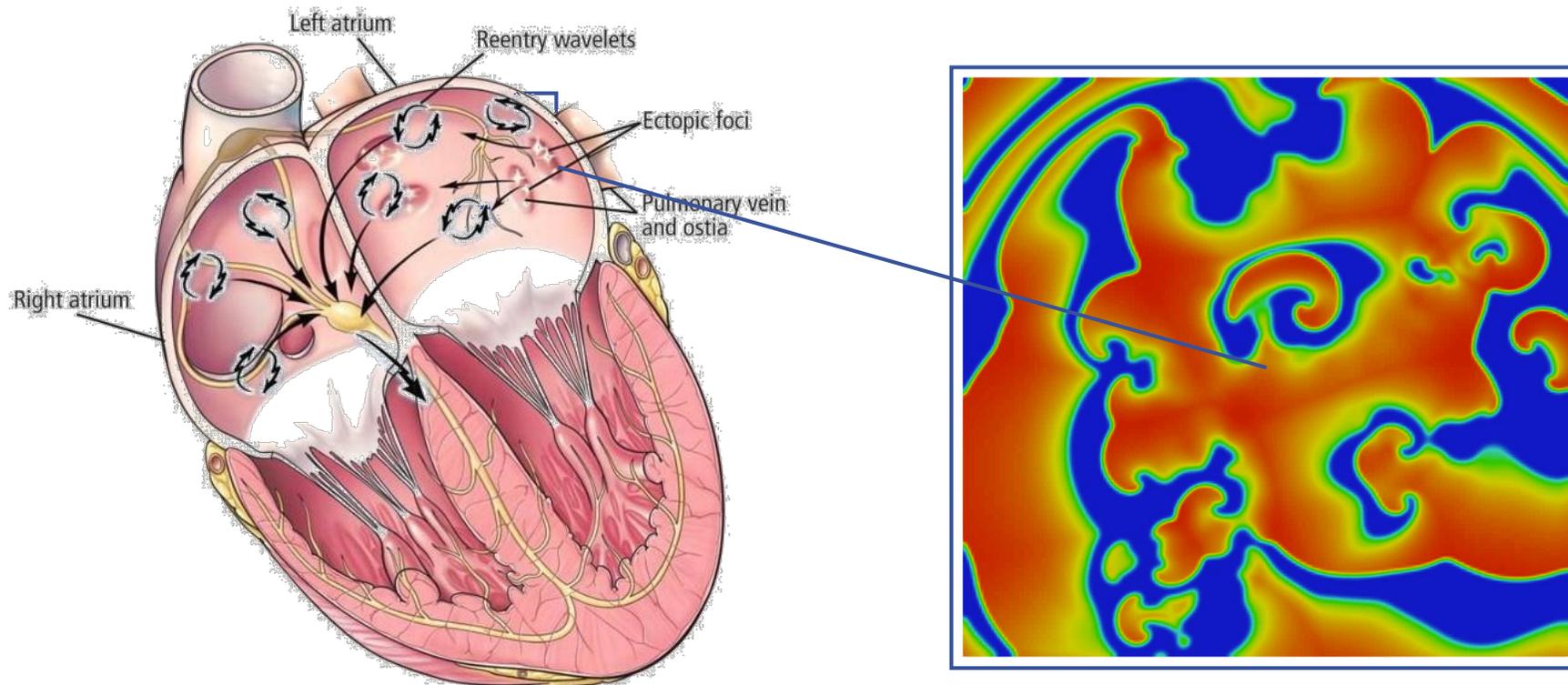
Aliev-Panfilov ionic model for atria

Monodomain semi implicit scheme with respect to I_{ion}
BDF2 in time; FEM P1 in space; # dof: 1.2M tetrahedra
 $h = 1\text{mm}$ $dt = 0.05\text{ ms}$

AF (Atrial Fibrillation) (S.Fresca)

Atrial Fibrillation (AF) is the most common type of **cardiac arrhythmia**.

AF is a condition in which heart electrical signal propagates in a **rapid and **irregular** way throughout the atria**



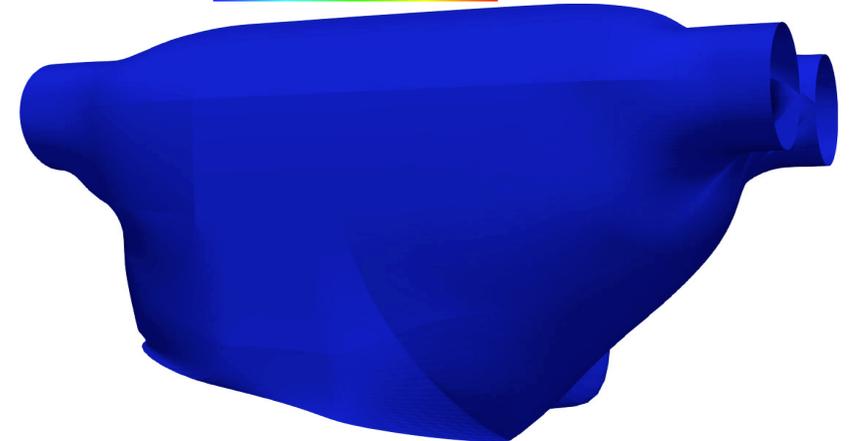
- During AF, atrial cells fire at rates of **200-600 times per minute**.
- AF causes substantial **morbidity** and an increase of mortality

Eight re-entry and re-entry breakup

Figure of
eight re-entry



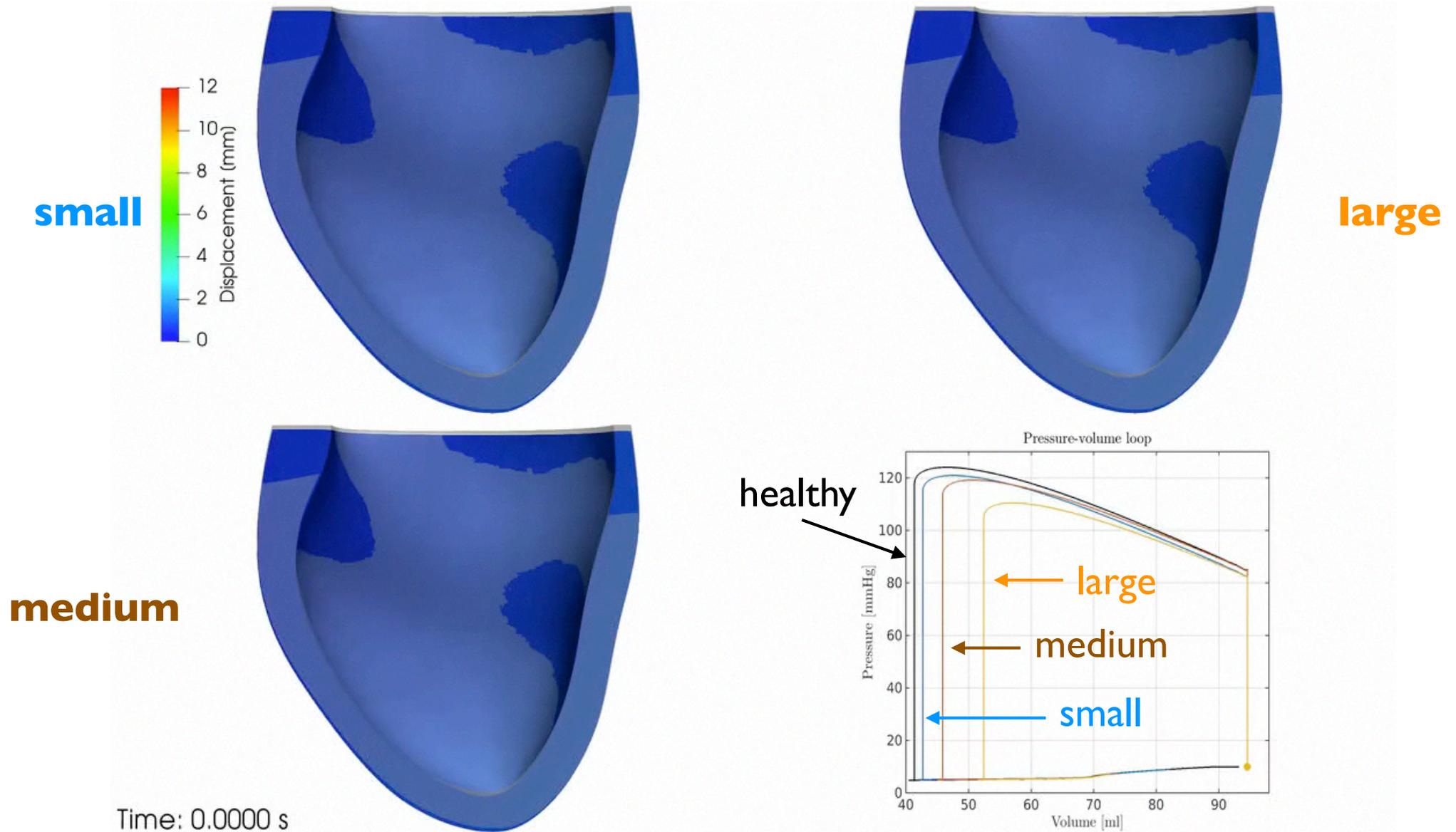
Re-entry break-up



Solutions obtained through **P2/C1 NURBS-based IGA** with $N = 61732$ and **BDF2 semi-implicit** scheme.

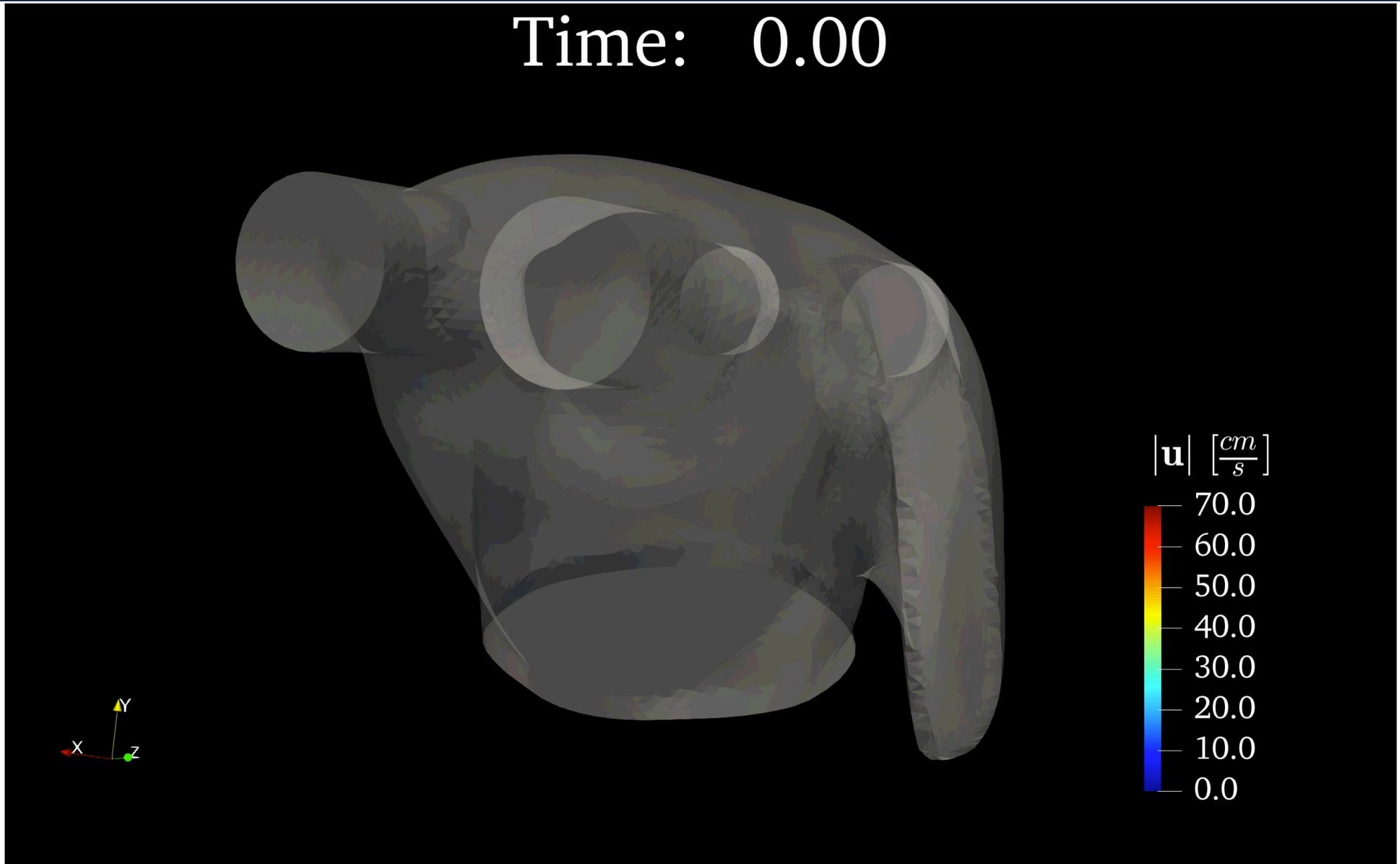
Simulating Electromechanics with Ischemic Necrosis (A. Gerbi)

We reproduce the PV loops for studying **scenarios** with different **sizes** of the **necrotic** regions (“small”, “medium”, and “large”).



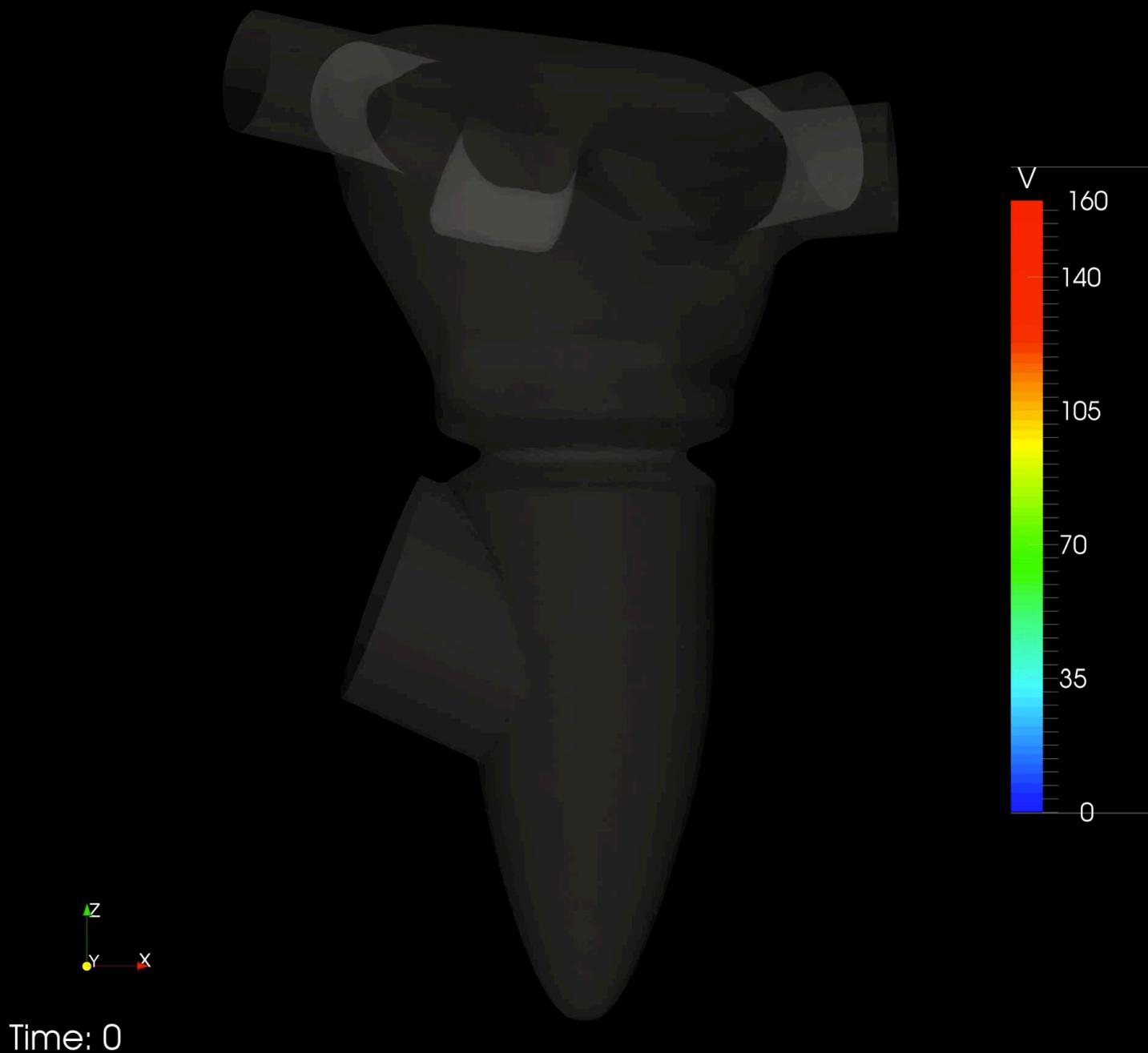
A Full Heartbeat in Left Atrium - Streamlines (A.Zingaro)

Time: 0.00

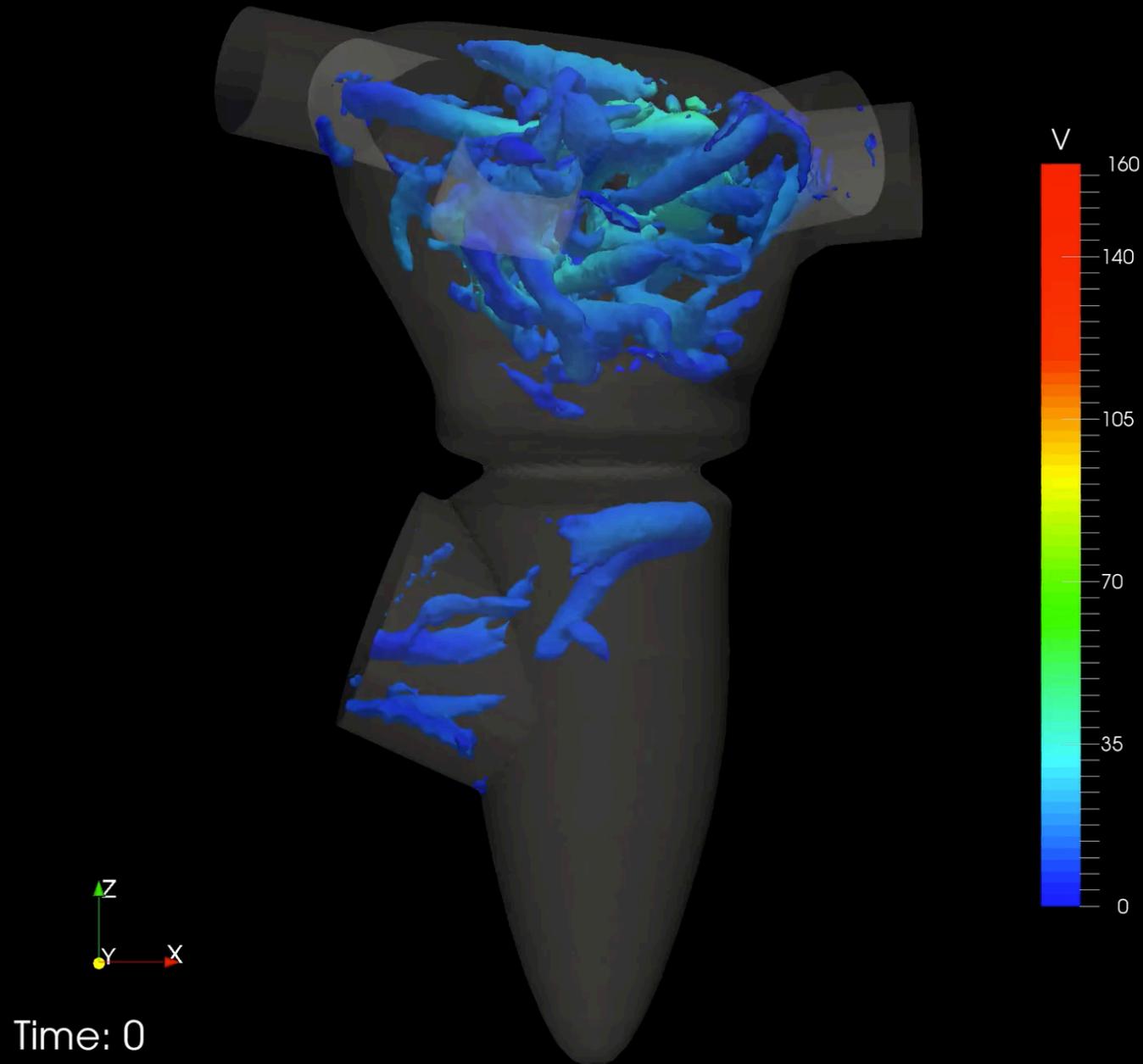


ALE-NS with VMS-LES; $h=1\text{mm}$, $\Delta t=0.005\text{s}$; diastole 0.-0.68s, systole 0.68-1.s
switching by Neumann to Dirichlet B.C. on mitral valve; auricula on front-right

Atrioventricular flow (left heart) (F. Menghini)



Atrioventricular flow (left heart): Q criterion (F. Menghini)



Aortic valve: numerical results

Velocity, pressure on the leaflets, pathlines, & particles residency time

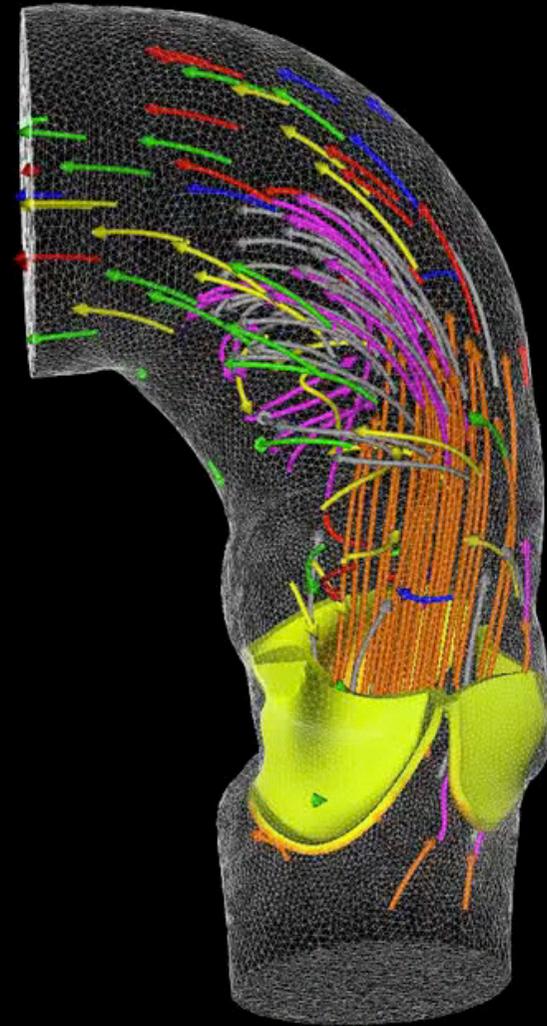
Patient-specific numerical simulation
of the aortic valve

M. Fedele^{1 2},

E. Faggiano², L. Dedè¹, S. Deparis¹, D. Forti¹, A. Laadhari¹, A. Quarteroni^{1 2}

Scientific Visualization by J. M. Favre³

¹ EPFL Lausanne, ² Politecnico di Milano, ³ CSCS



VMS-SUPG stabilization, P1-P1 FEM, BDF2

Accounting for Variability (and Uncertainty)

Accounting for Uncertainty

Major challenges facing cardiac modelling include parameter inference from uncertain experimental measurements, model personalisation to patient data, model selection, model discrepancy from reality, and the way these factors affect the confidence in model prediction

Epistemic uncertainty

Lack of knowledge (didn't measure it)

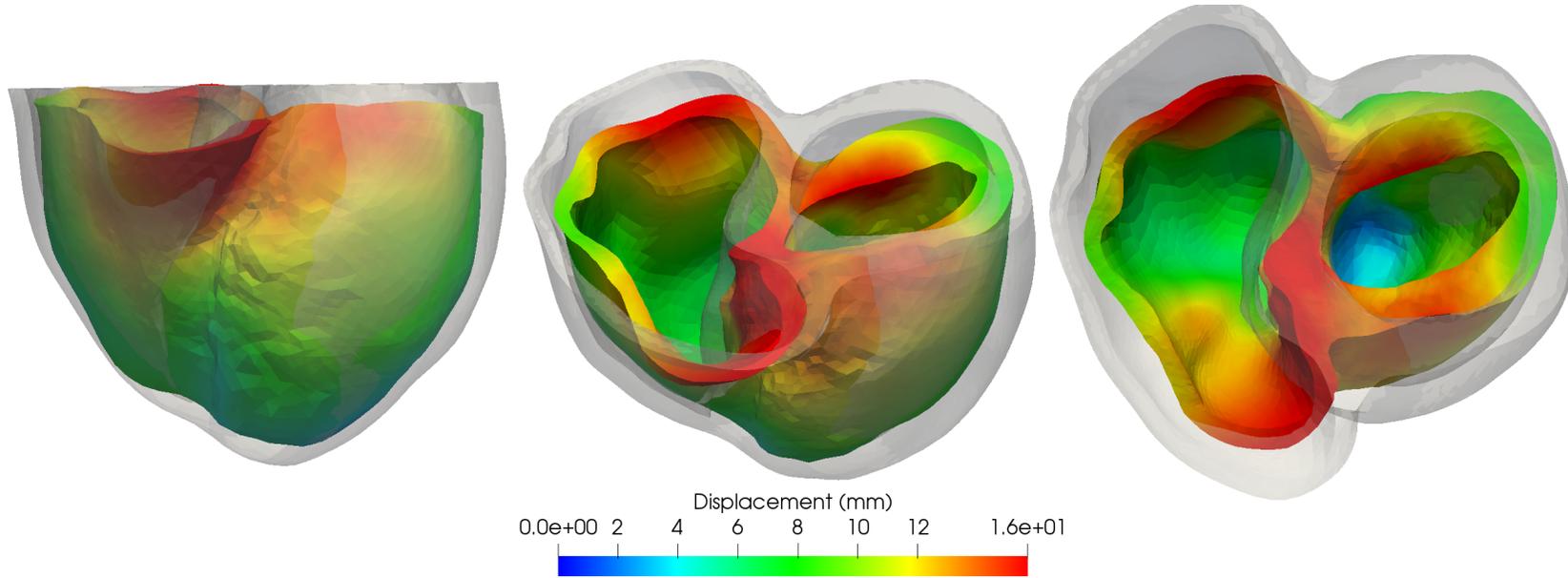
Experimental error (didn't measure it correctly)

Aleatory uncertainty

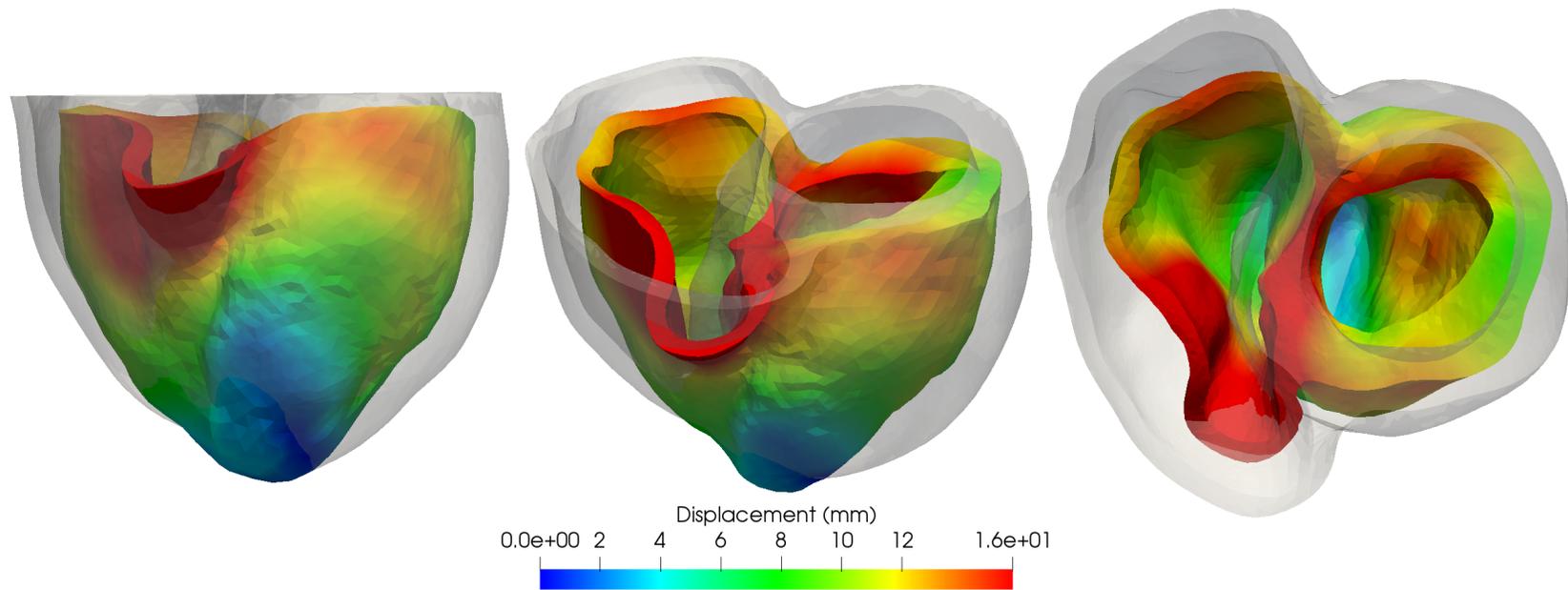
Stochasticity (an individual reacts differently each time: intrinsic)

Variability (between individuals: extrinsic)

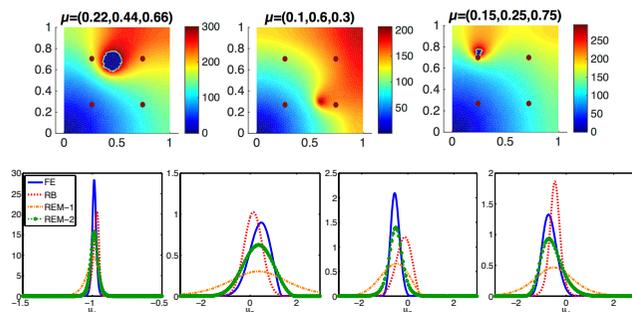
Two different fiber angles - effect on displacement



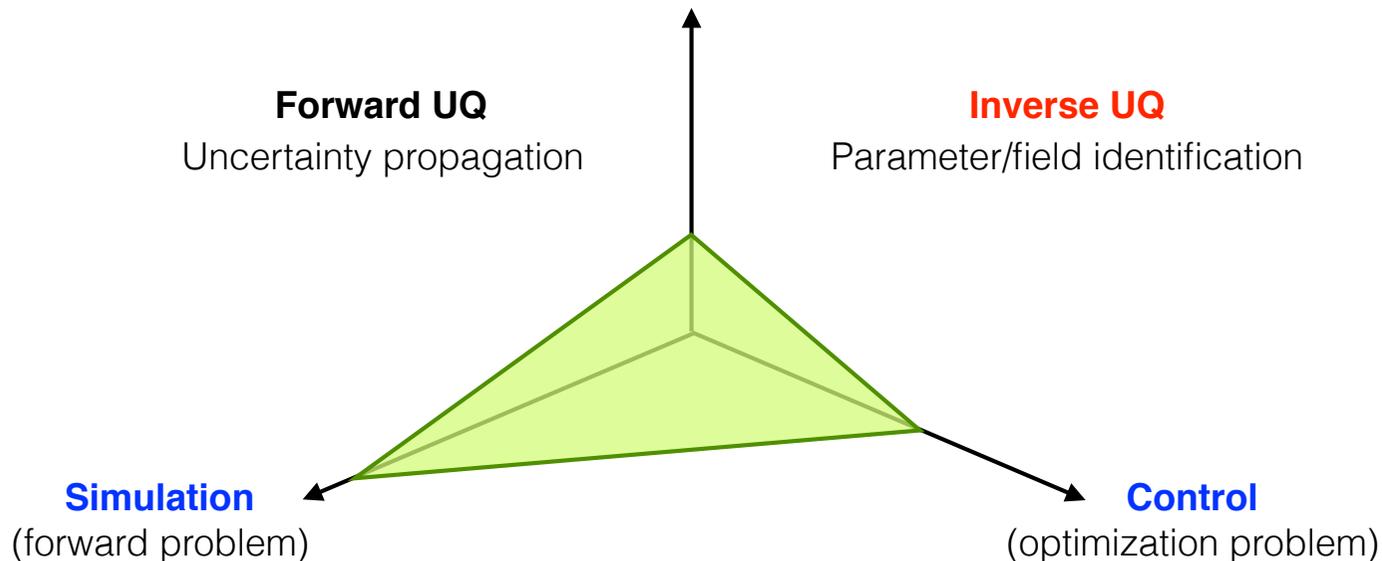
(a)



(b)

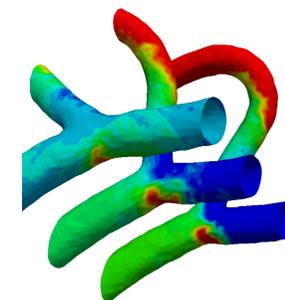
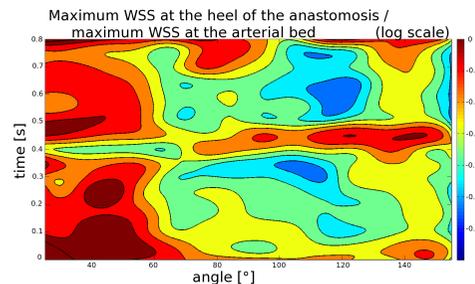
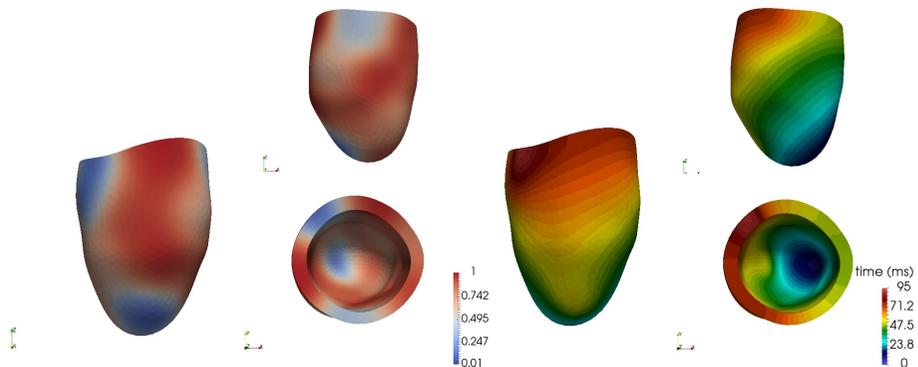


Uncertainty



Nonlinear, time-dependent, parametrized PDEs
 (e.g. electrophysiology/nonlinear mechanics)
 Hyper-reduction for nonlinear/nonaffine PDEs

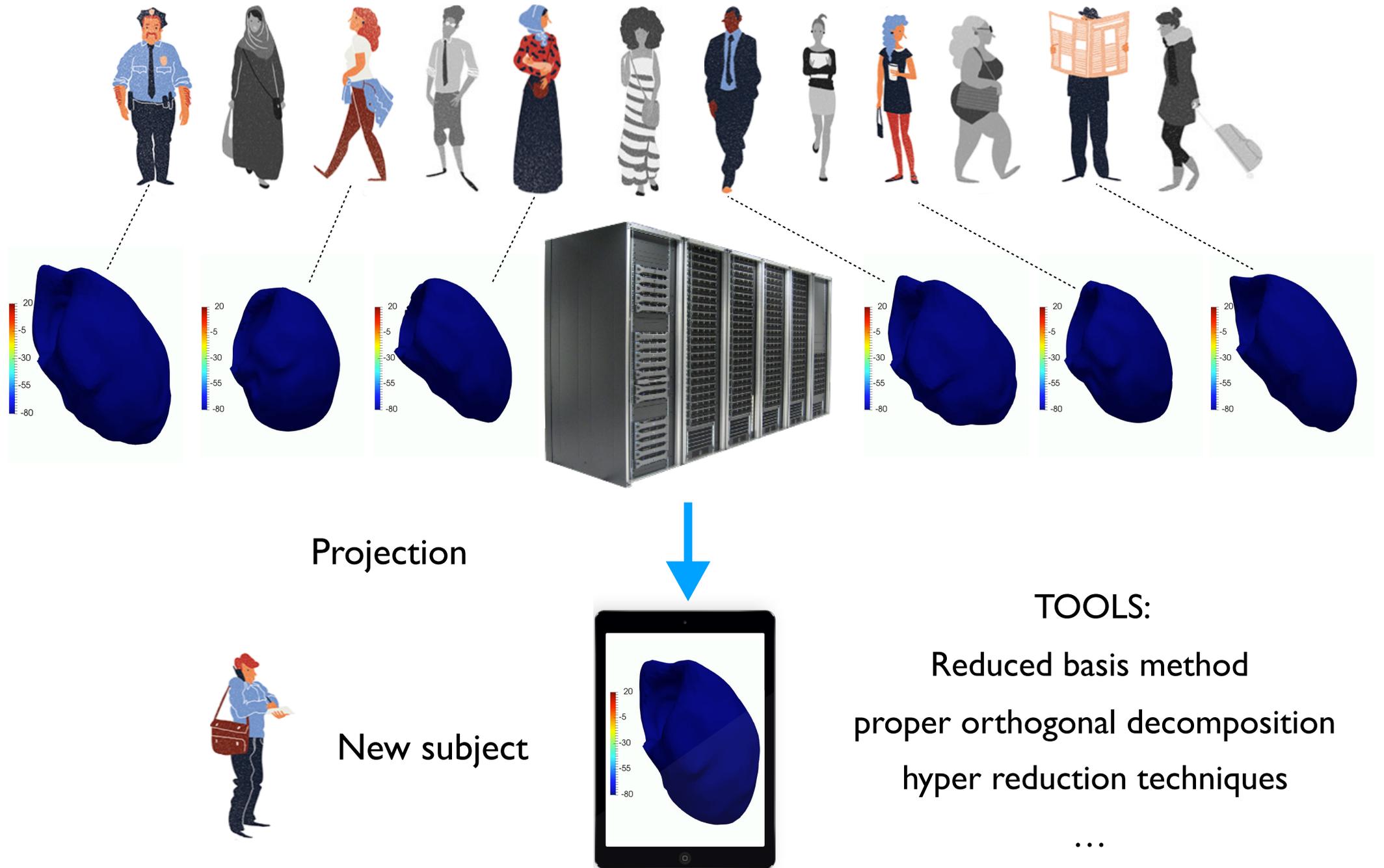
Parametric optimization
 (optimal control/optimal design)
 Parametrized optimal control problems



One Week *
for
One Second

*** Pizz Daint (27 petaflop)**

Reduced-order models



AIM

Better understanding of physiology (quantitative analysis)

Supporting clinical decision-makings

Help designing optimal surgical operations

FEATURES

Non-invasive

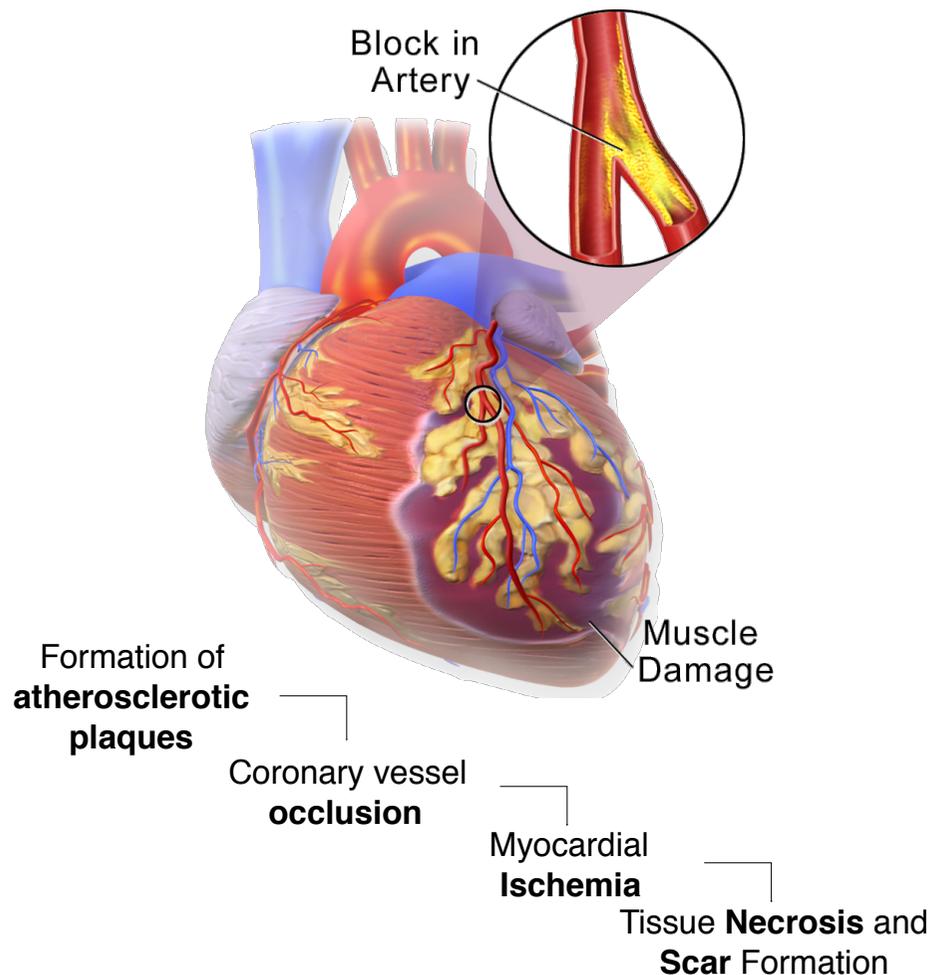
Accurate

Reliable

Inexpensive (research apart)

Myocardial Perfusion

The **myocardial perfusion** is the delivery of blood to the heart muscle, named *myocardium*, supplied by the *coronary circulation*



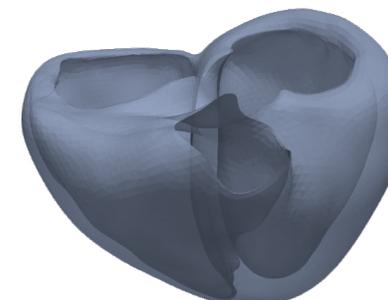
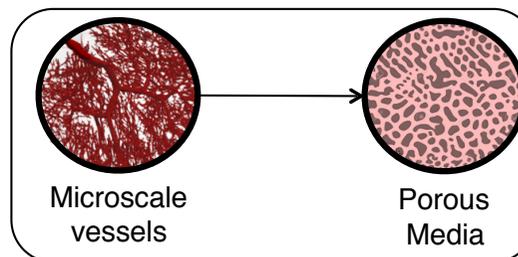
Multiscale modeling approach

Epicardial Vessels: **3D Navier-Stokes Equation**



Intramural Vessels: **Multi-Compartment Darcy Model**

Homogeneization



➤ First cause of death in western countries (36% in 2010) [Herrington et al. 2016]

A collaboration with: Dott. G. Pontone



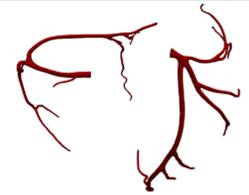
A Three Compartment Model

Epicardial Vessels: 3D Navier-Stokes Equation

$$\rho \left(\frac{\partial \mathbf{u}_C}{\partial t} + (\mathbf{u}_C \cdot \nabla) \mathbf{u}_C \right) - \mu \nabla \cdot \left(\nabla \mathbf{u}_C + (\nabla \mathbf{u}_C)^T \right) + \nabla p_C = \mathbf{0} \quad \text{in } \Omega_C,$$

$$\nabla \cdot \mathbf{u}_C = 0 \quad \text{in } \Omega_C$$

\mathbf{u}_C coronary blood velocity
 p_C coronary blood pressure
 ρ blood density
 μ blood viscosity
 Γ_{out} terminal outlet



Intramural Vessels: Multi-Compartment Darcy Model

To capture the **different length scales** of the intramural vessels
 (radius from 300 to 8 μm)

3 Darcy compartments **co-existing** in the same domain

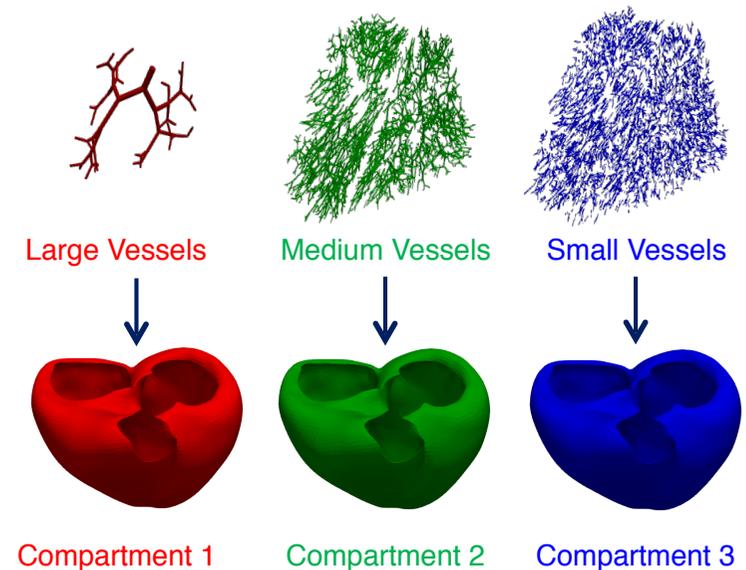
$$\mathbf{K}_i^{-1} \mathbf{u}_i + \nabla p_i = 0 \quad \text{in } \Omega_M,$$

$$\nabla \cdot \mathbf{u}_i = \sum_{k=1}^3 \beta_{i,k} (p_i - p_k) \quad \text{in } \Omega_M \quad i = 1 \dots 3$$

+ interface contribution coming from coronaries

\mathbf{u}_i Darcy velocity \mathbf{K}_i permeability tensor
 p_i pore pressure $\beta_{i,k}$ inter-compartment coupling coefficient

$\beta_{i,k}$ and \mathbf{K}_i are estimated from a **1D intramural vessel network**



Interface Conditions

Third Newton's Law

based on the hydraulic analog of Ohm's law
 between coronaries and first compartment

$$p_C - \mu (\nabla \mathbf{u}_C + (\nabla \mathbf{u}_C)^T) \mathbf{n} \cdot \mathbf{n} - \frac{1}{\alpha} \int_{\Gamma_{out}} \mathbf{u}_C \cdot \mathbf{n} d\gamma = \frac{1}{|\Omega_M|} \int_{\Omega_M} p_1(x) dx \quad \text{on } \Gamma_{out},$$

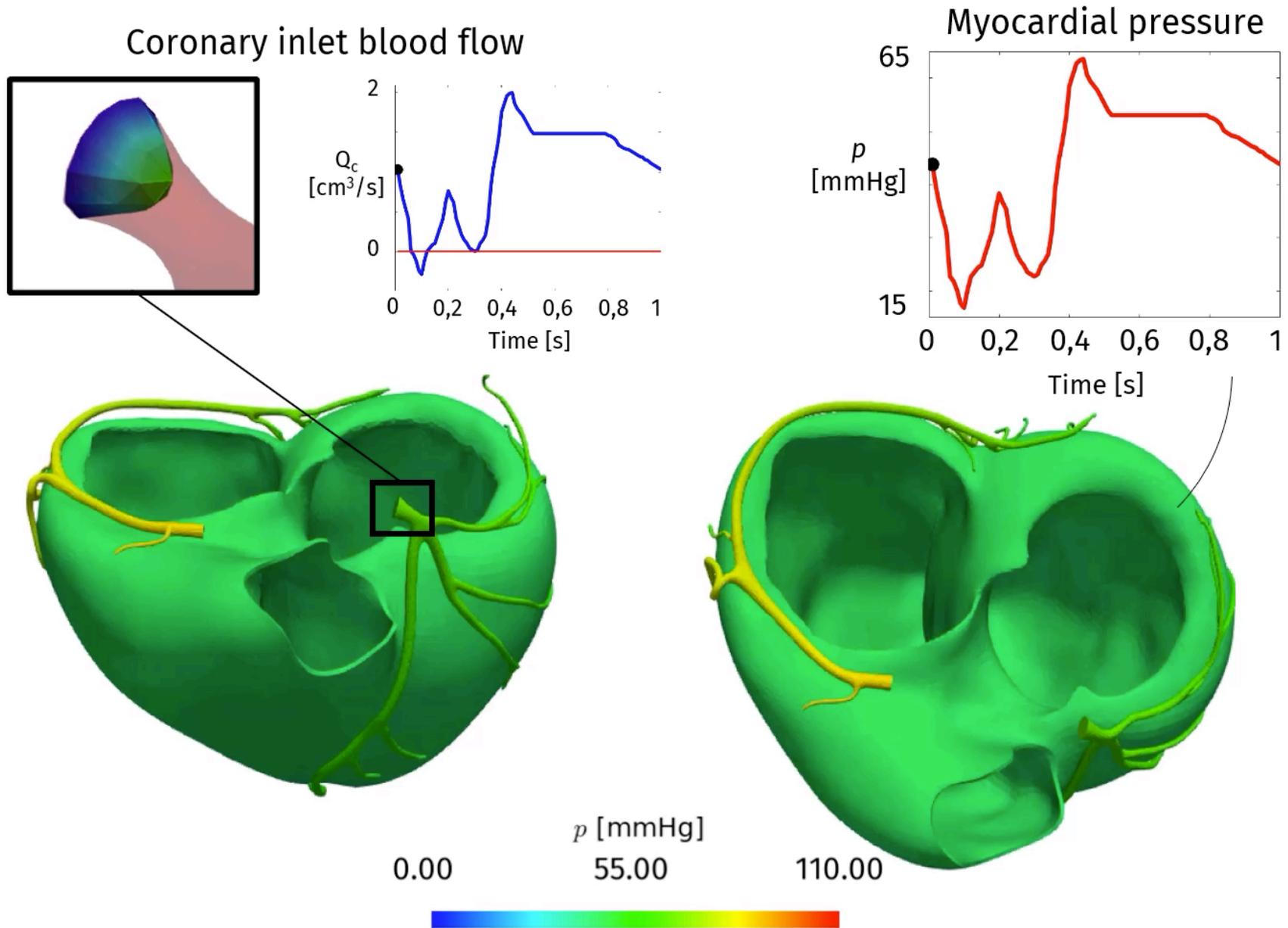
$$\mu (\nabla \mathbf{u}_C + (\nabla \mathbf{u}_C)^T) \mathbf{n} \cdot \boldsymbol{\tau}_i = 0, \quad i = 1, 2 \quad \text{on } \Gamma_{out}$$

Mass Conservation

$$\nabla \cdot \mathbf{u}_1 = \frac{1}{|\Omega_M|} \int_{\Gamma_{out}} \mathbf{u}_C \cdot \mathbf{n} d\gamma - \sum_{k=1}^3 \beta_{1,k} (p_1 - p_k) \quad \text{in } \Omega_M$$

Myocardial Perfusion

Myocardial perfusion: evolution of the blood pressure



Different coronary by-passes (with R. Scrofani, Ospedale Sacco Milano)

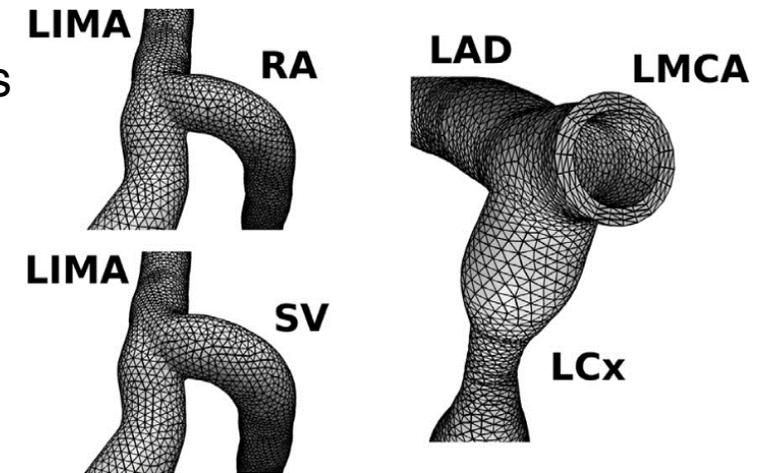
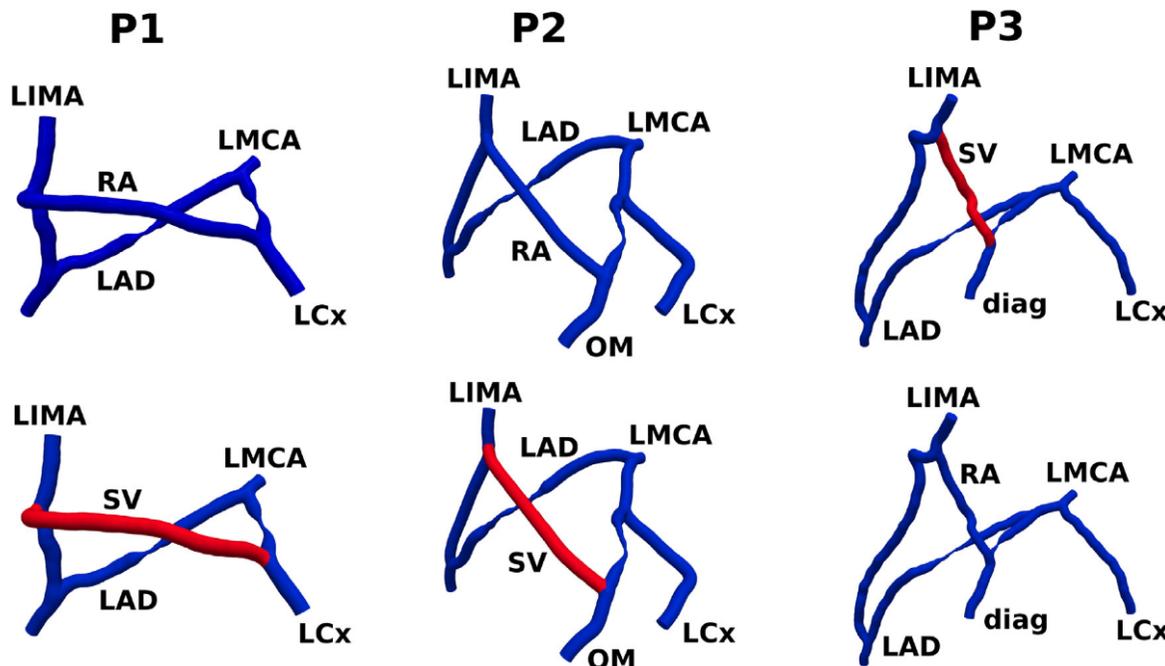
Aim of the computational study:

Comparison of the performance between radial artery (RA) and saphenous vein (SV)
(Guerciotti, Vergara, Ippolito, Quarteroni, Antona, Scrofani, Medical Engineering & Physics, 2017)

3 patients (P1, P2, P3), 2 with RA and 1 with SV

For each of them we virtually design the alternative by-pass (in red)

Fluid-structure interaction simulations



The virtual scenario is performed by **changing the geometry** (lumen and vessel wall) **and the elastic properties** (10^5 Pa for RA, 10^6 Pa for SV)

Comparison between different coronary by-passes

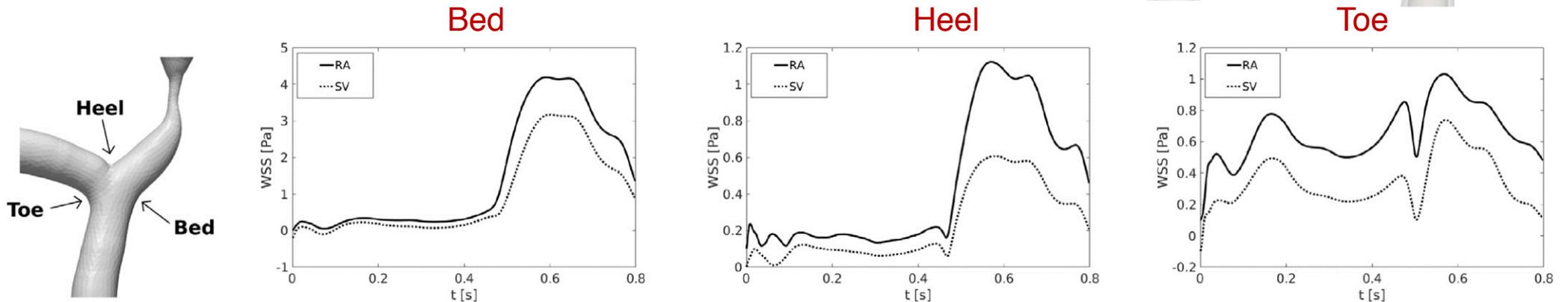
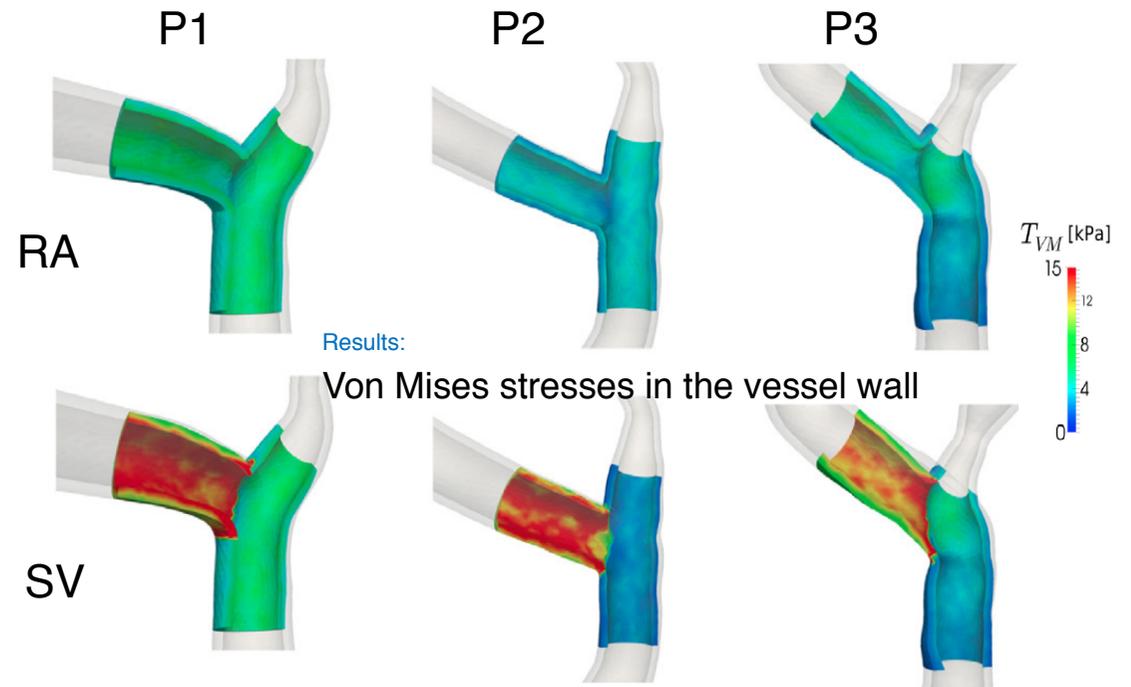
Models:

Fluid: Incompressible Navier-Stokes equations

Vessel wall: Hooke law (linear elasticity)

Partitioned algorithm (Robin-Robin)

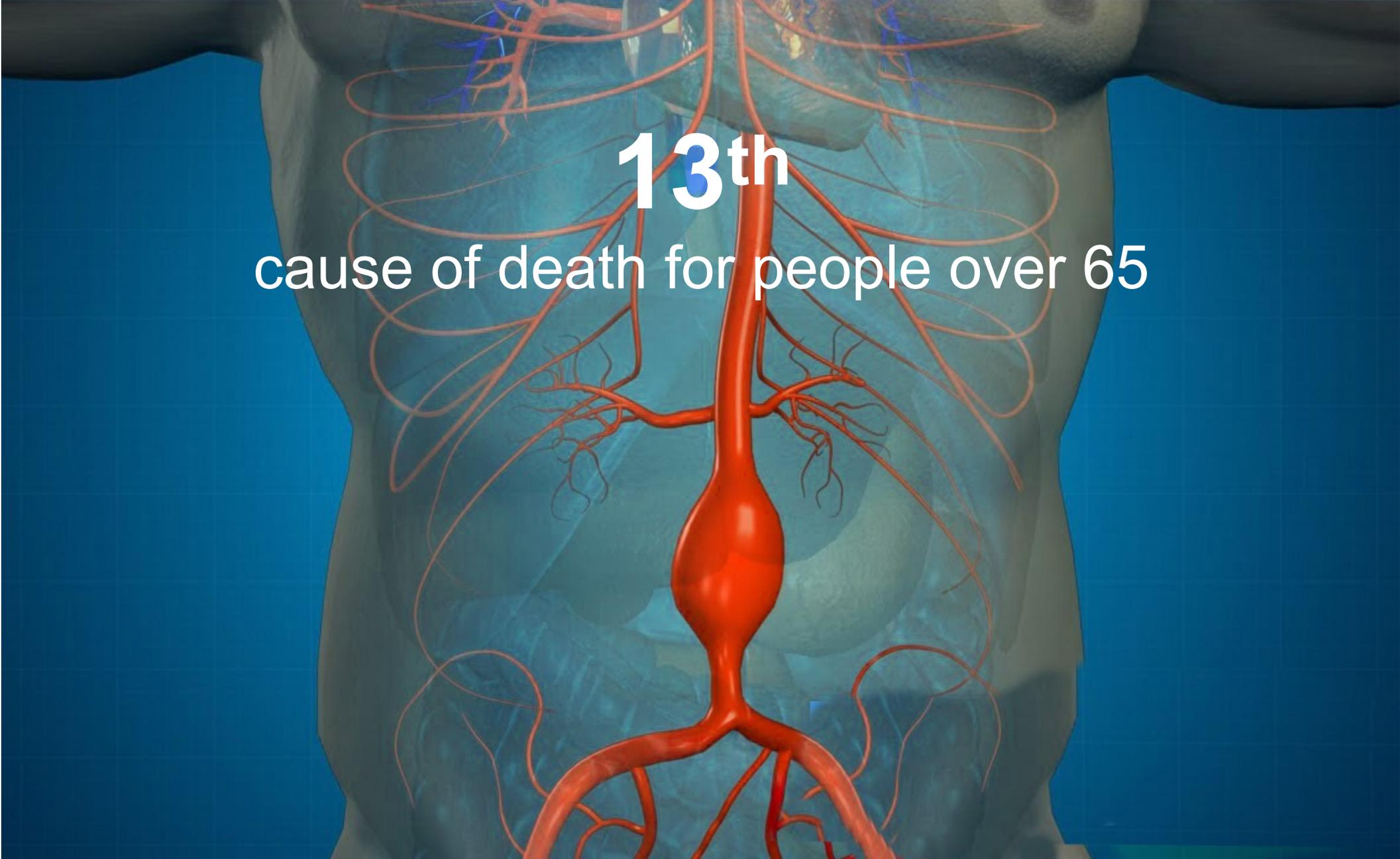
LIFEV – www.lifev.org



Radial artery by-pass seems to reduce conditions that could promote restenosis (high Von Mises stress and low WSS)

Abdominal Aortic Aneurysm (AAA)

13th
cause of death for people over 65

An anatomical illustration of the human torso, showing the internal organs and the circulatory system. The abdominal aorta is highlighted in a bright red color, and a large, bulbous aneurysm is visible in the abdominal region. The text '13th cause of death for people over 65' is overlaid on the image.

Numerical simulations for AAA

NUMERICAL MODEL SETUP - DISCRETIZATION

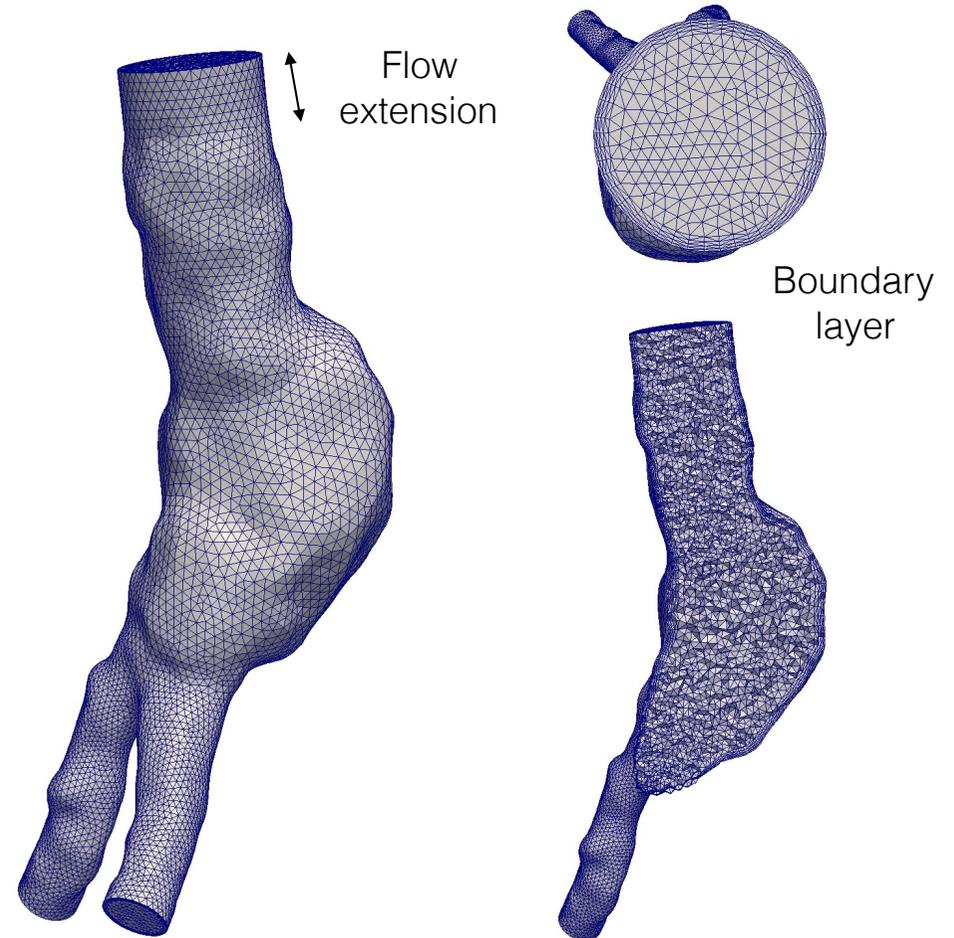
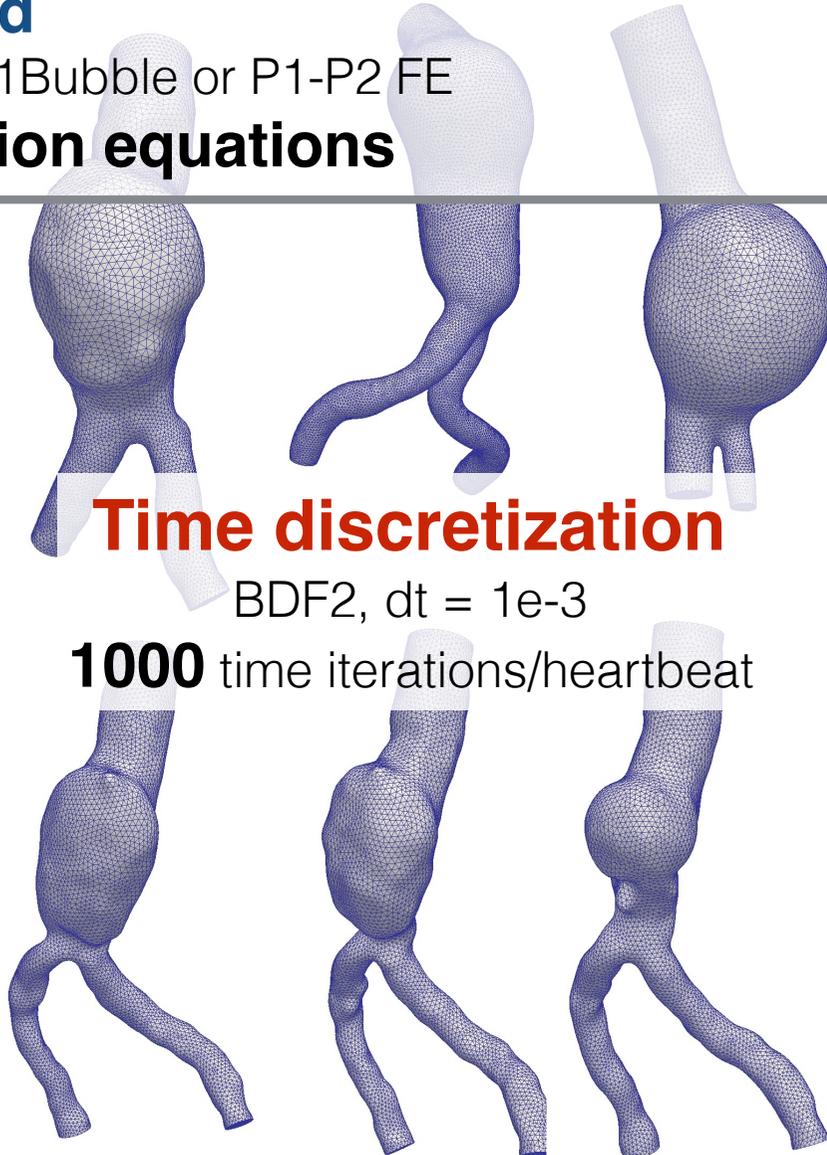
Finite Element Method

Fluid

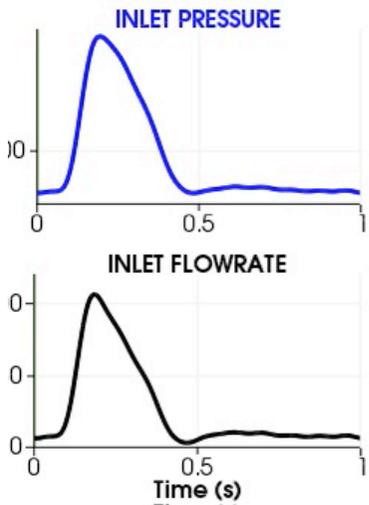
P1-P1Bubble or P1-P2 FE
million equations

Structure

P2 Finite Elements
hundred thousand equations



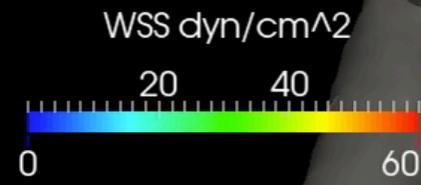
Numerical simulations for AAA



Patient : p057
Age : 64
Sex : M
Pressure : 140/85
Aortic Aneurysm (AAA) : none
History : NA

aXurge

@cmcs-epfl



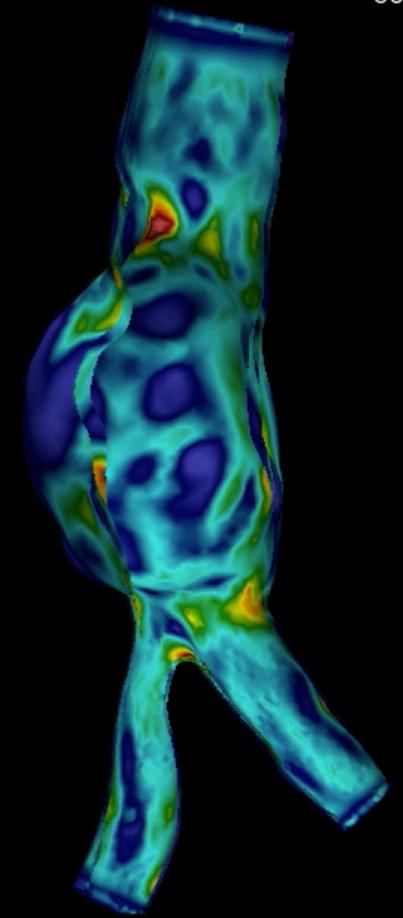
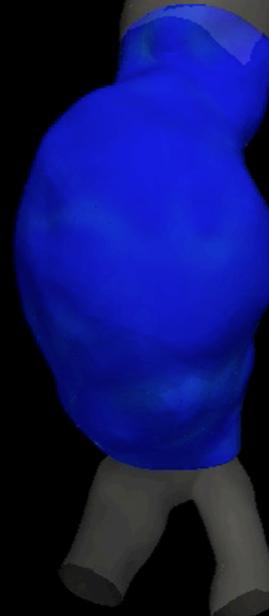
Systolic peak

Time: 0.2 s

VonMises Stress N/cm²



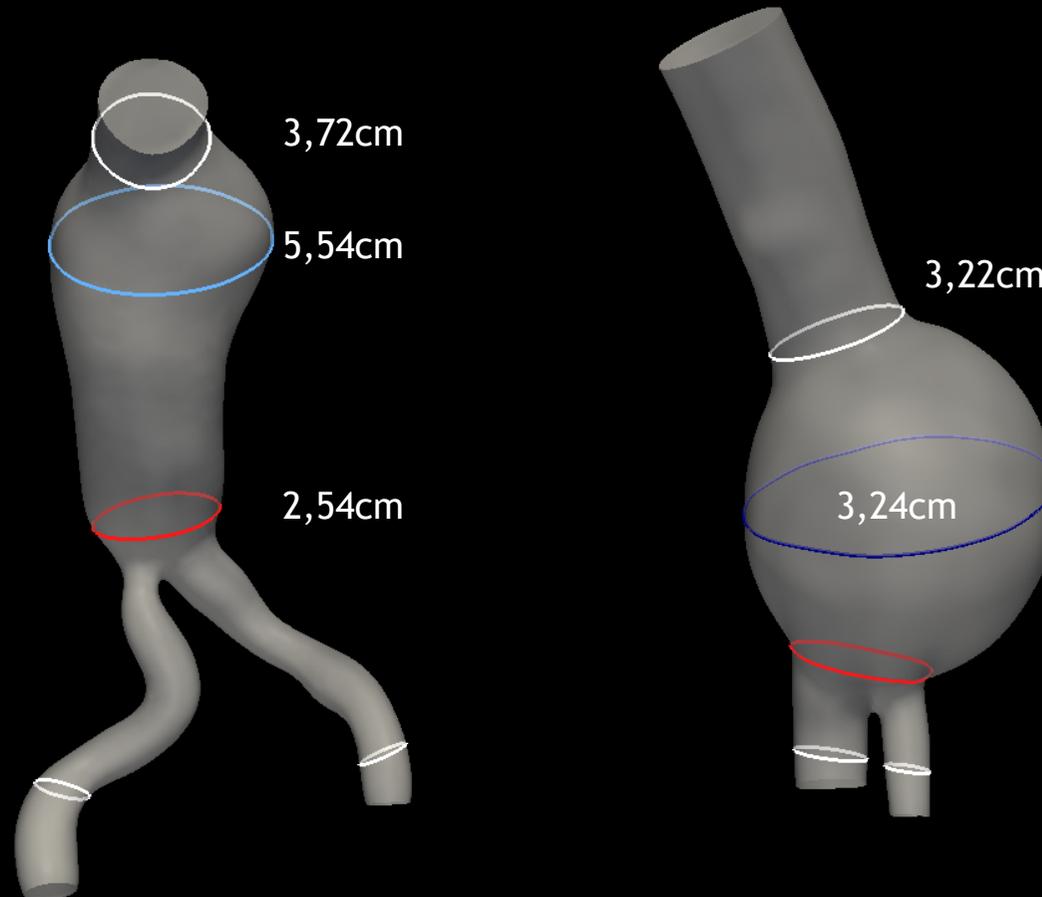
Inlet section



Platform Features

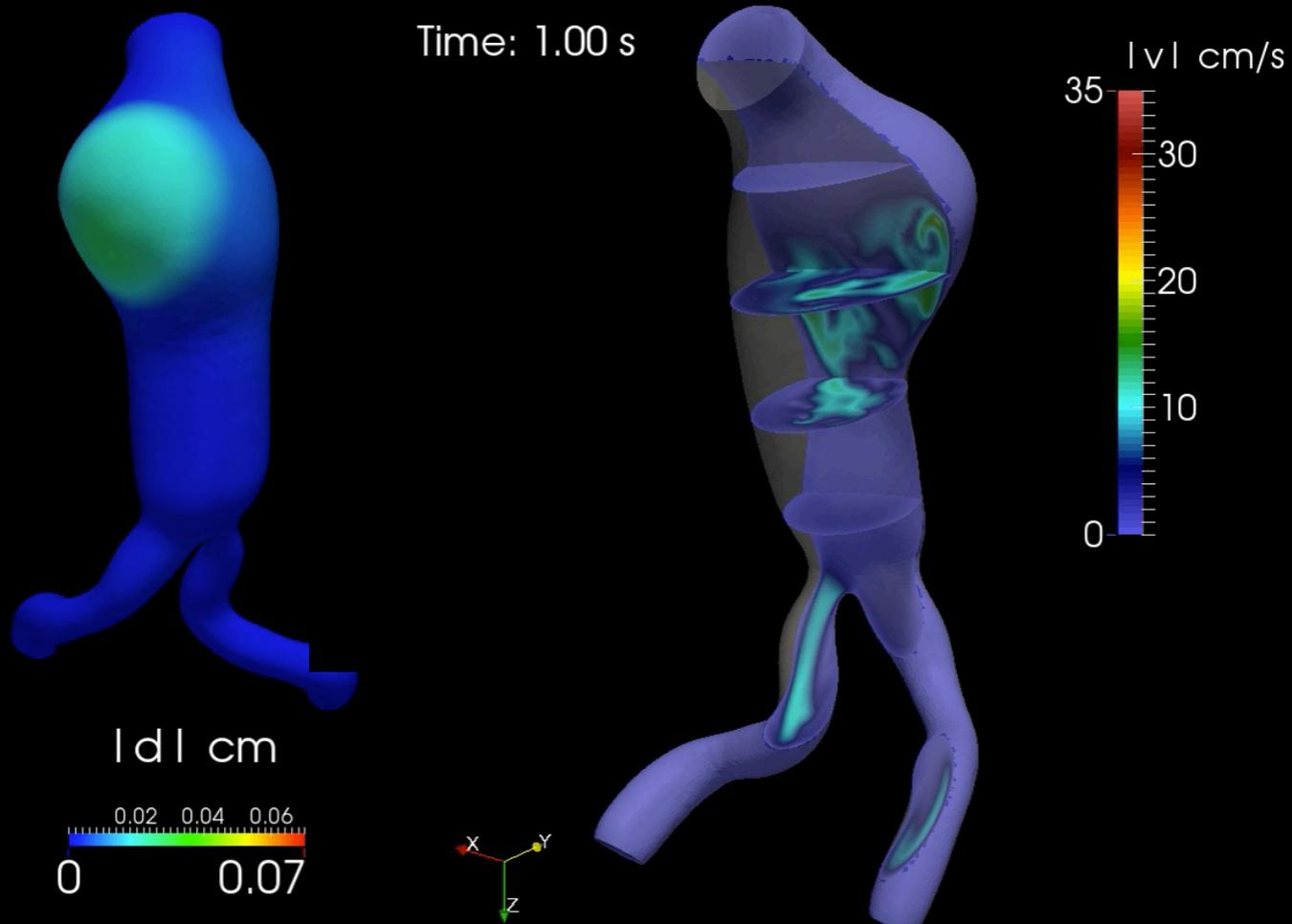
Imaging & Automatic Sizing

Accurate measurement of the aneurysm size



Platform Features

Advanced Numerical Simulation



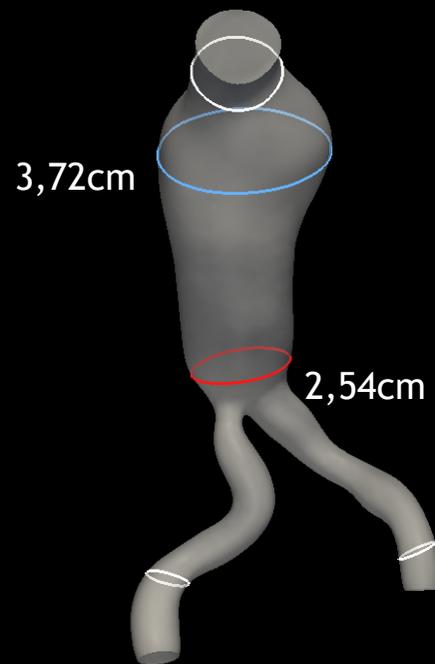
Platform Features



Maurizio Domanin
Vascular Surgeon



Smart Surgical Planner



Automatic selection
of the proper device

