

SILICOFCM

Decision Support System for prediction of Heart Failure disease

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University of Kragujevac, Serbia

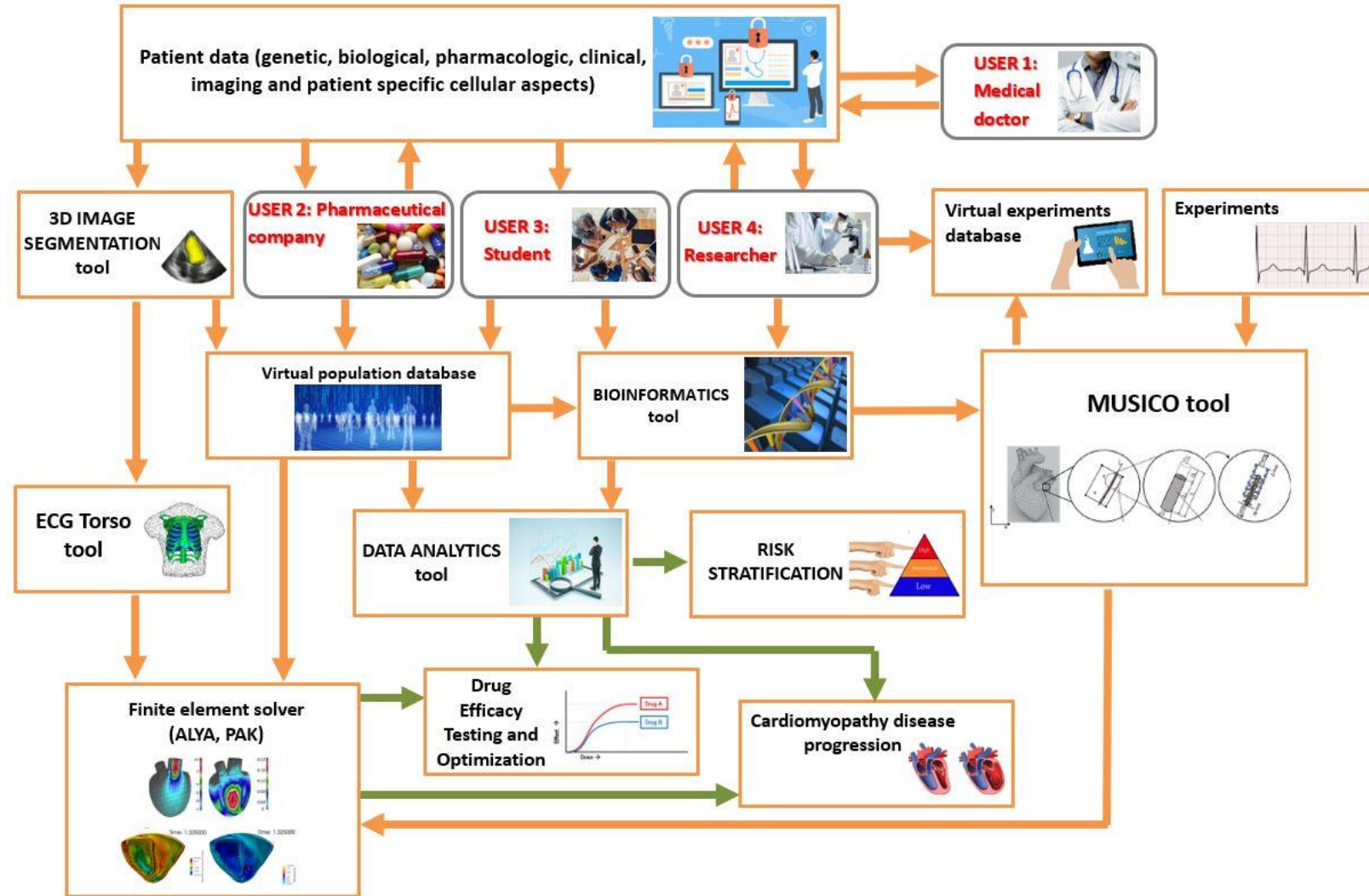
3rd CONFERENCE ON NONLINEARITY
4–8.09.2023, Belgrade, Serbia



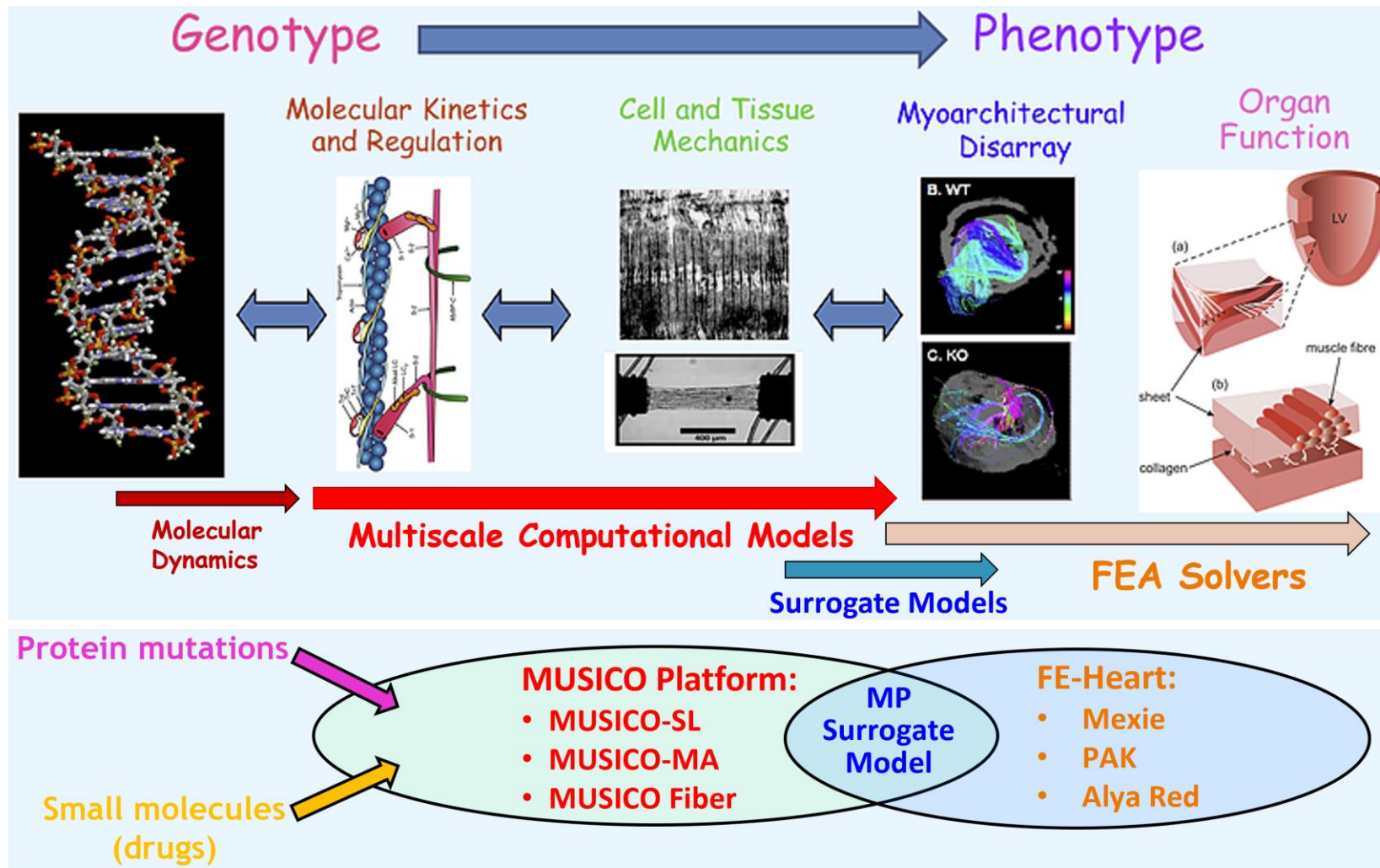
*This project has received funding from the European Union's Horizon 2020
research and innovation programme under grant agreement No 777204*

SILICOFCM Scope and Concept

- ▶ SILICOFCM aims to develop a computational platform for *in silico* clinical trials of Familial cardiomyopathies (FCMs) that would take into consideration comprehensive list of patient specific features (genetic, biological, pharmacologic, clinical, imaging and patient specific cellular aspects) capable of **optimizing and testing medical treatment strategy** with the purpose of maximizing positive therapeutic outcome.
- ▶ The SILICOFCM platform is based on the integrated multidisciplinary and multiscale methods for analysis of patient-specific data and development of patient-specific models for monitoring and assessment of patient condition from current through the progression of disease.

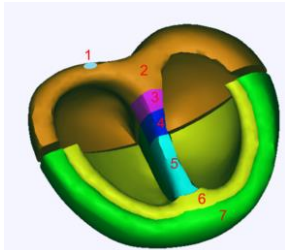


Multiscale Integration of Experiments at Molecular, Cellular and Organ Level



Set up R&D computation pipelines for drug testing

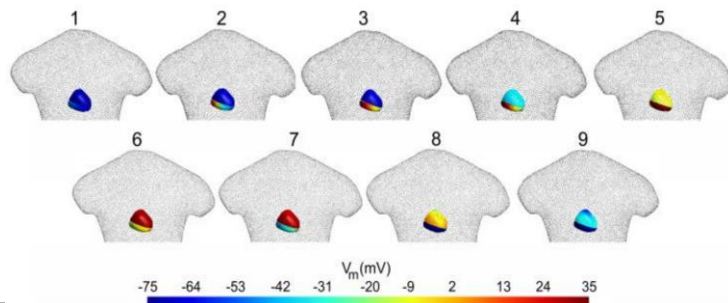
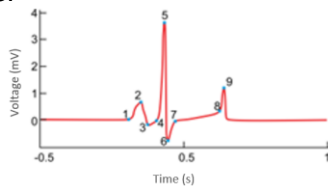
Scenario #4 Electric Field of Heart Model Embedded in Torso



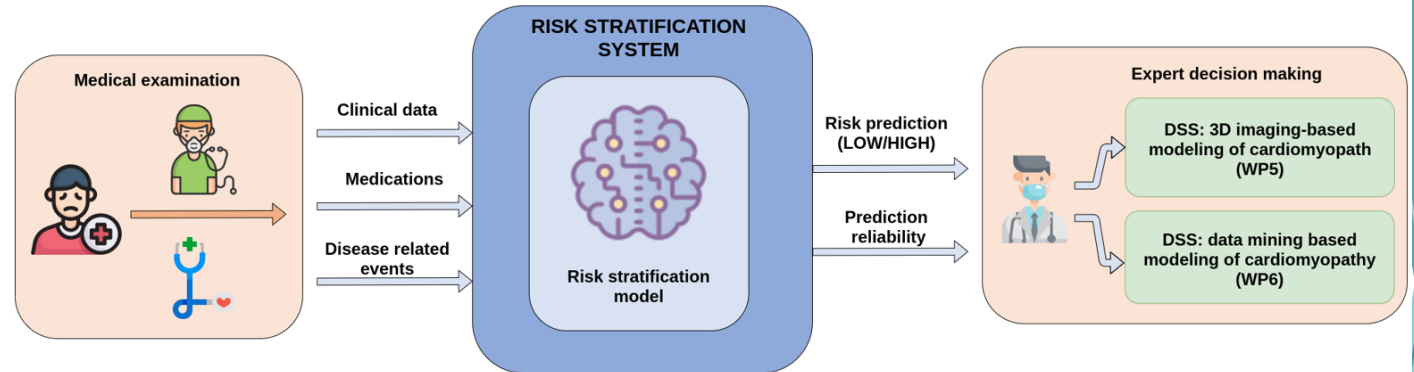
- 1) Sinoatrial node
- 2) Atria
- 3) Atrioventricular node
- 4) His bundle
- 5) Bundle fibers
- 6) Purkinje fibers
- 7) Ventricular myocardium

PAK

Finite element solver

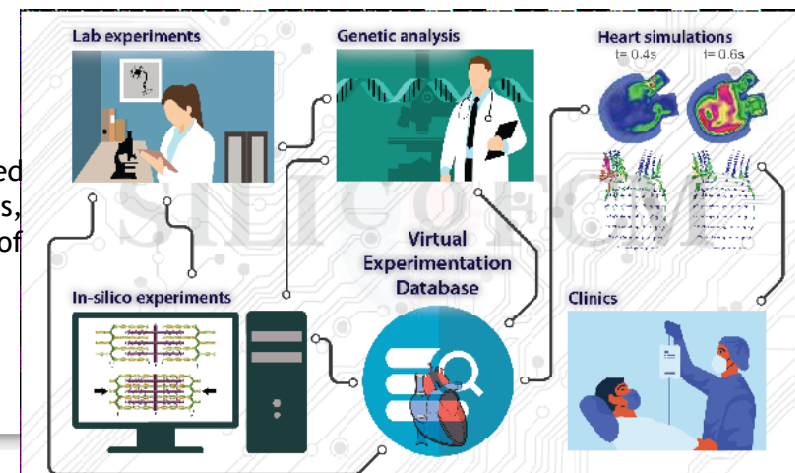


Scenario #5 Data Analytics Tool (Risk Stratification System)



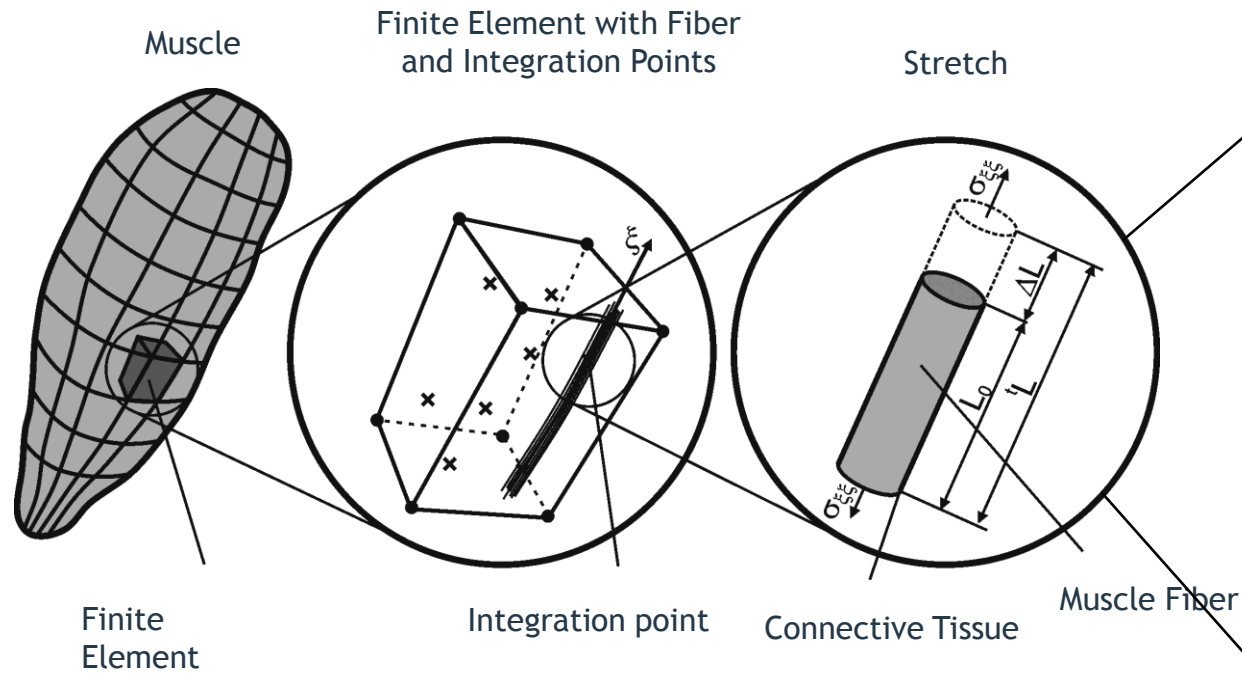
Scenario #6 From Genetics to Heart Simulations - population of virtual experimentation database

Three case scenarios are being explored using MUSICO tool: Myosin mutations, Mutations of Cardiac troponin C, Effects of drugs on heart function.

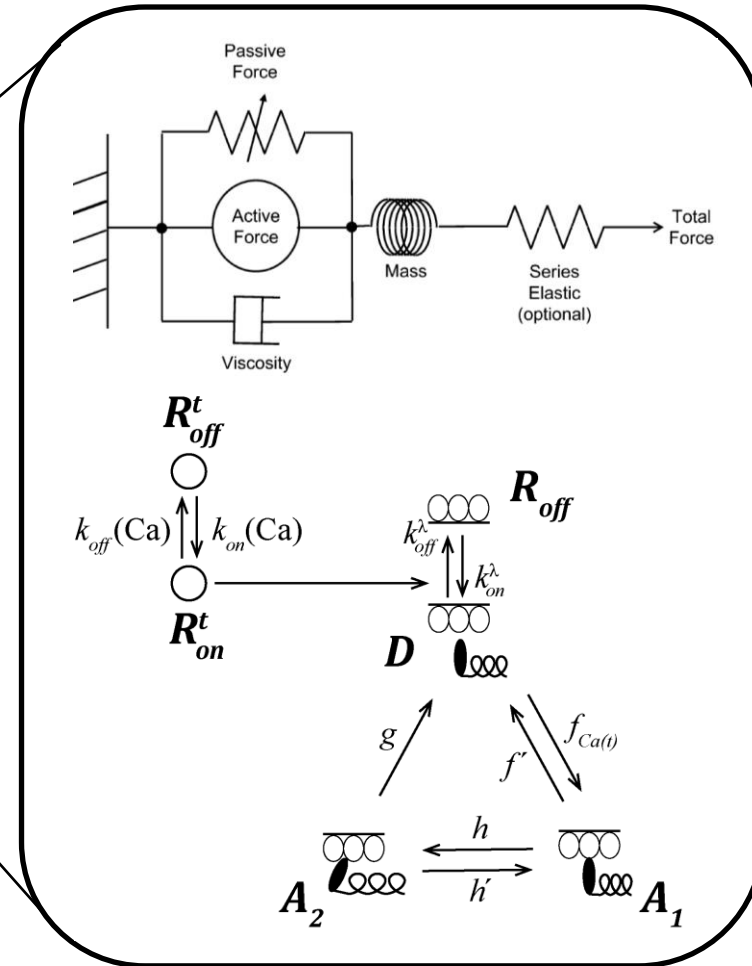


Target \ prediction	Model MD	Expert E	Consortium C	Joint J
NYHA	0.30 ± 0.48	0.84 ± 0.69	0.56 ± 0.34	0.43 ± 0.29
LA	1.70 ± 0.82	1.69 ± 0.97	1.66 ± 0.70	1.68 ± 0.50
LA_vol	1.00 ± 0.82	1.25 ± 0.98	1.13 ± 0.63	0.84 ± 0.51
LVIDd	0.80 ± 0.63	1.09 ± 0.91	1.00 ± 0.77	0.74 ± 0.49
LVIDs	0.50 ± 0.71	1.02 ± 0.86	0.88 ± 0.68	0.69 ± 0.29
LVEF	0.90 ± 0.88	1.32 ± 0.90	1.28 ± 0.79	1.09 ± 0.65

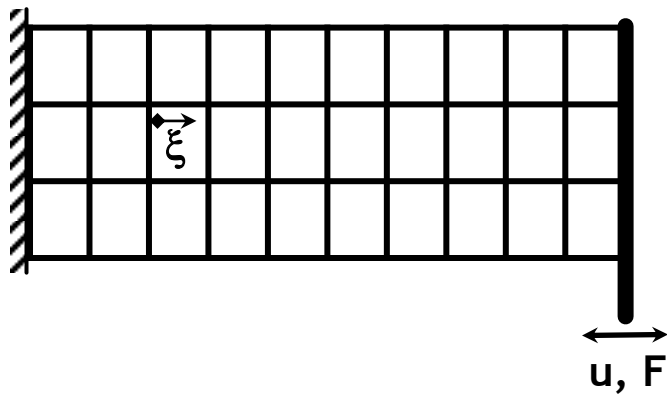
Linking MP Micromodel and FE Biomechanical Simulation TWO-scale Muscle MODEL



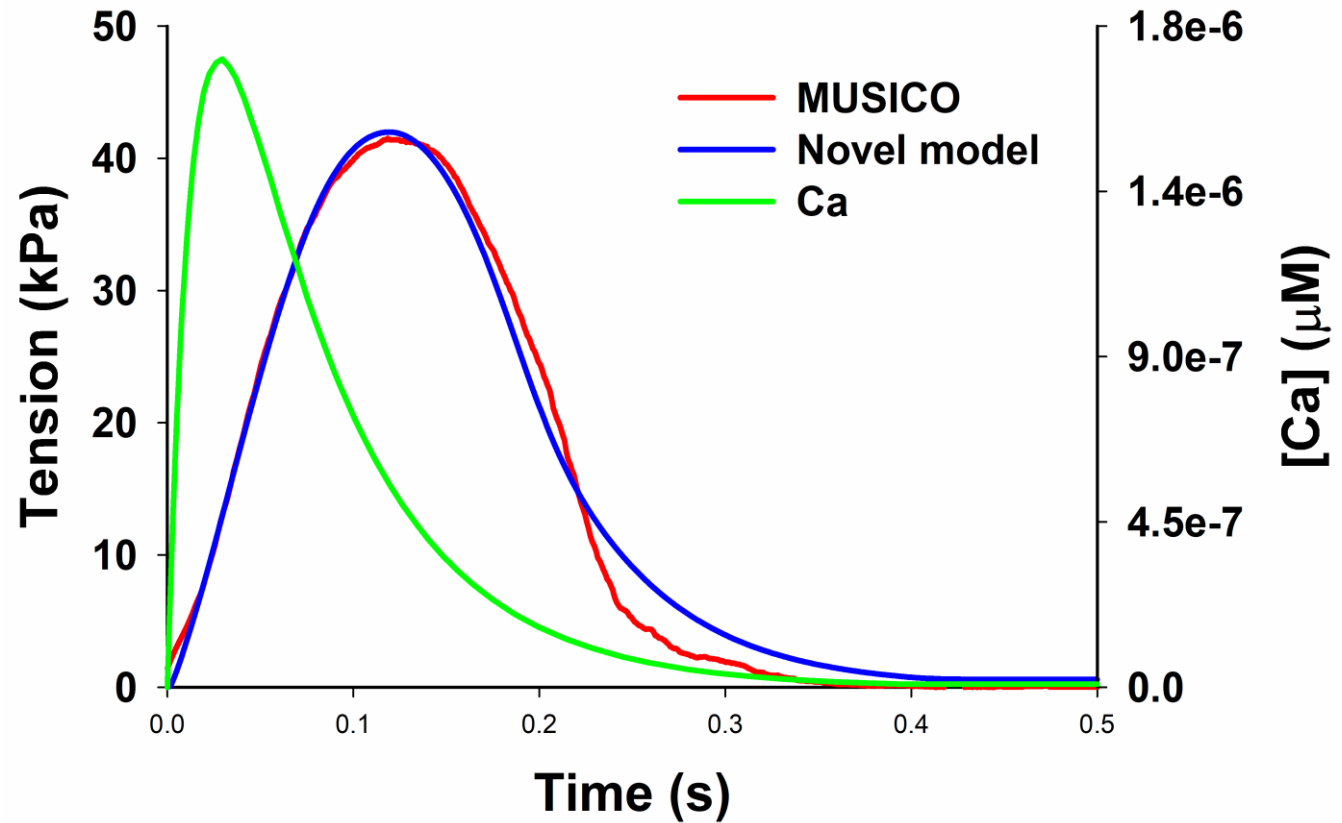
MP micromodel and Physiological macromodel:
Different time/space scale Complex computation



Linking MP Micromodel and FE Biomechanical Simulation of Isometric Twitch



Execution times (s)	
MUSICO	27881.433
FE-MP	37.376

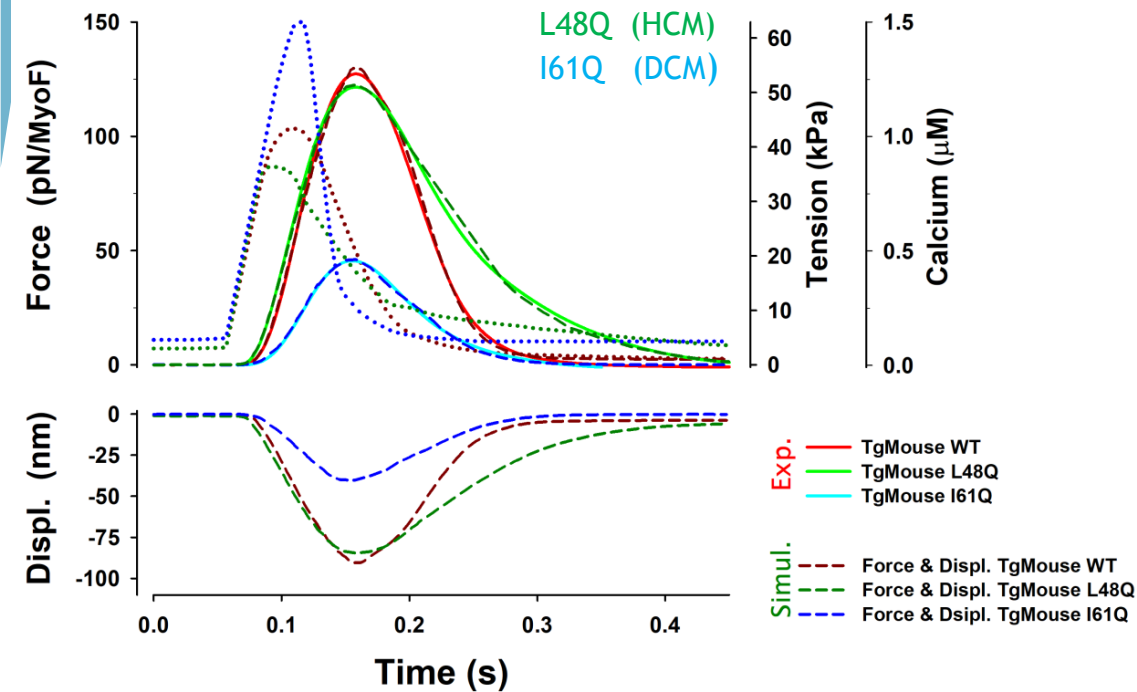


MEXIE Simulations

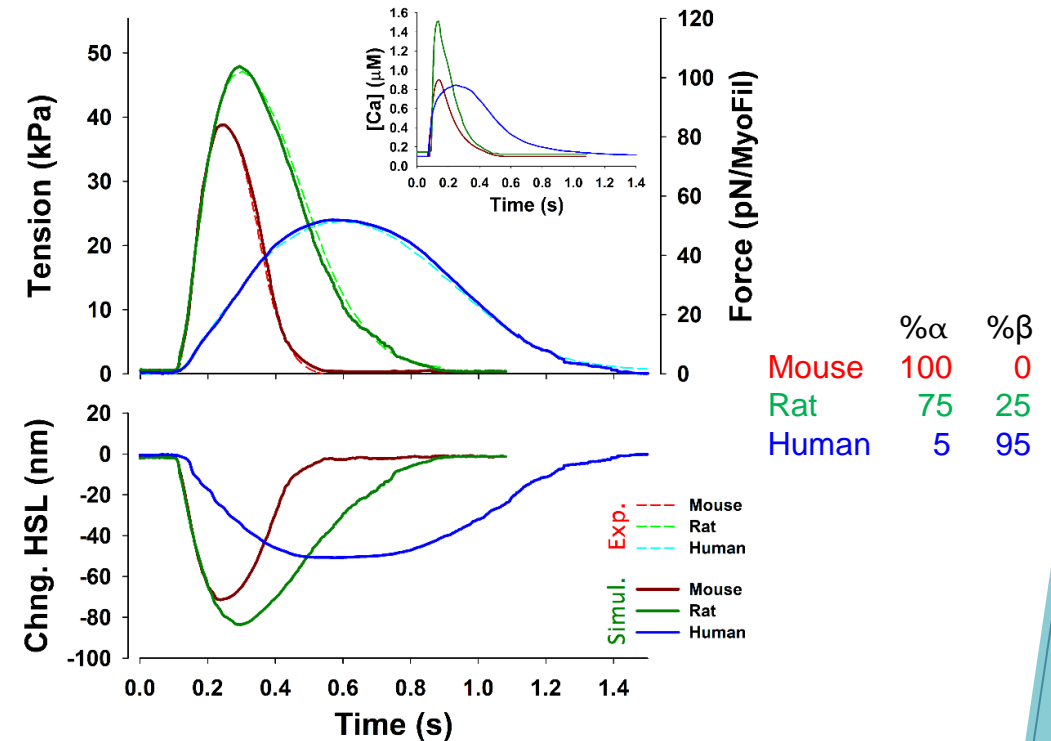


Effect of Mutations in Troponin C (TnC) and Myosin Isoforms from Mouse to Human

TnC Mutations in Mouse



Myosin Isoforms across the Species

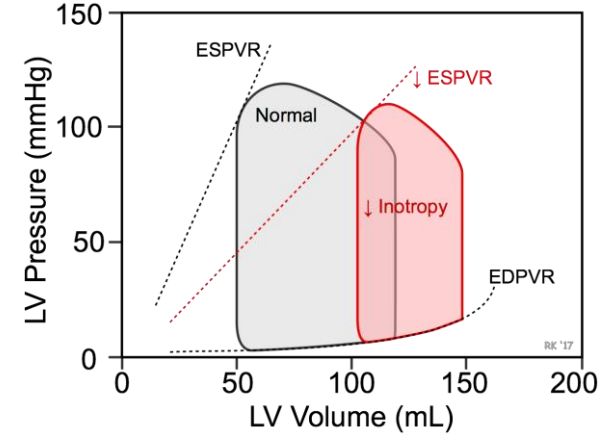
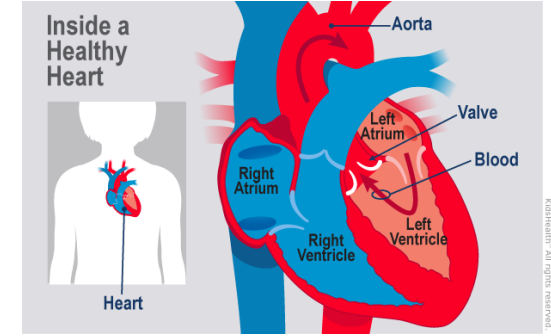
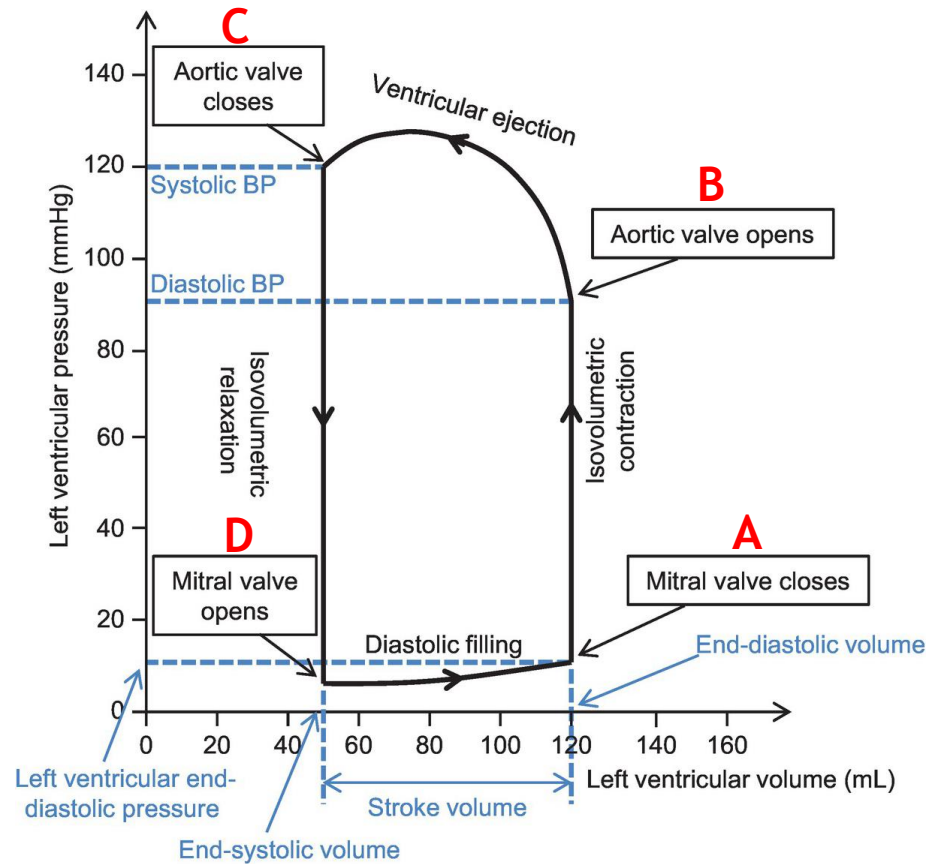
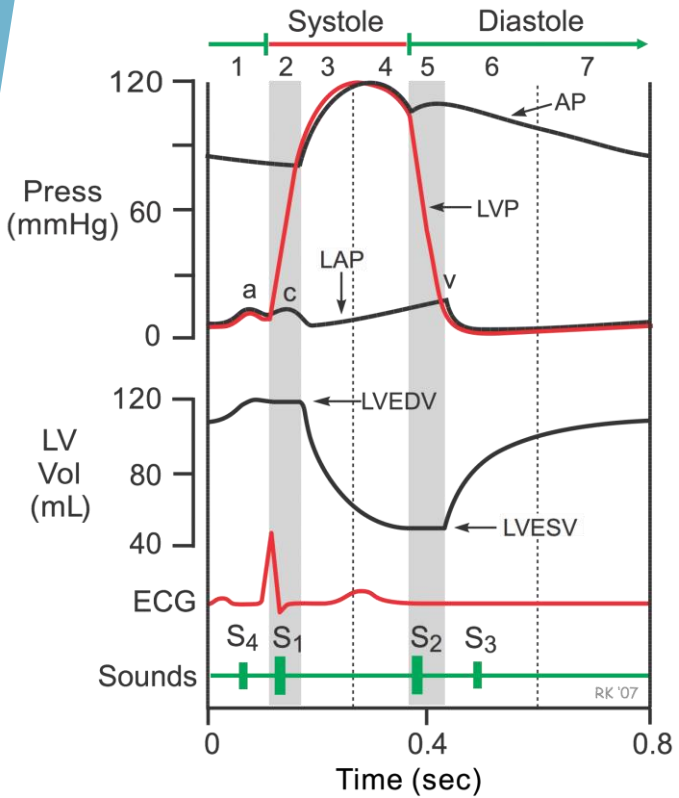


Mijailovich et al., 2021,
J Mol Cell Cardiol, 155:112-124

Prodanovic et al., 2022,
Int. J. Mol. Sci, 23, 1135

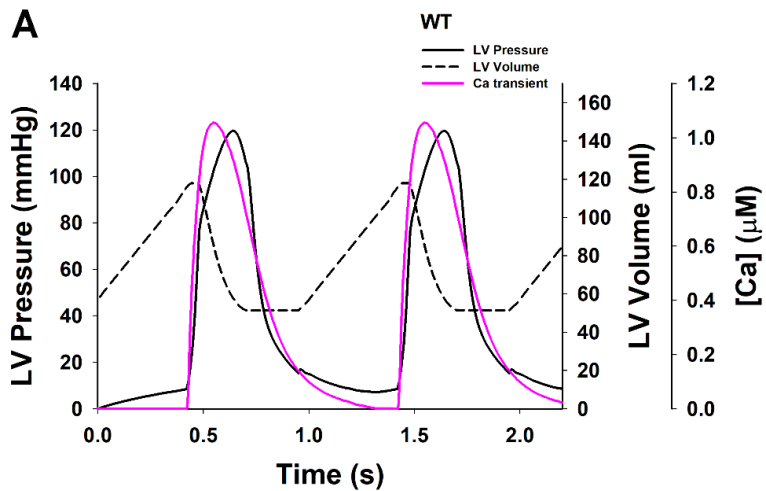


Left Ventricular Pressure-Volume

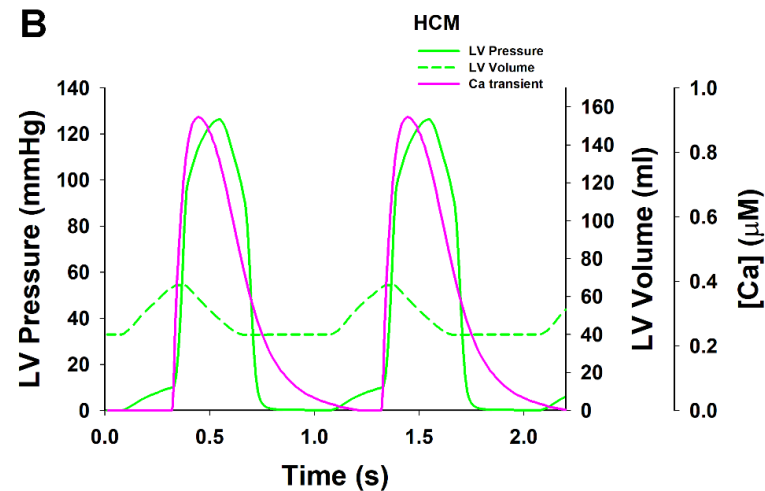


Left Ventricular Calcium, Pressure and Volume Traces During Two Heartbeats

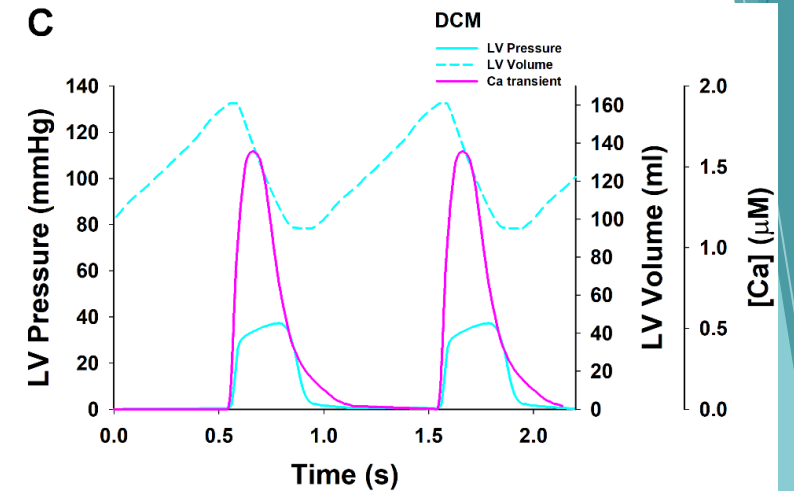
Healthy



Hypertrophic Cardiomyopathy



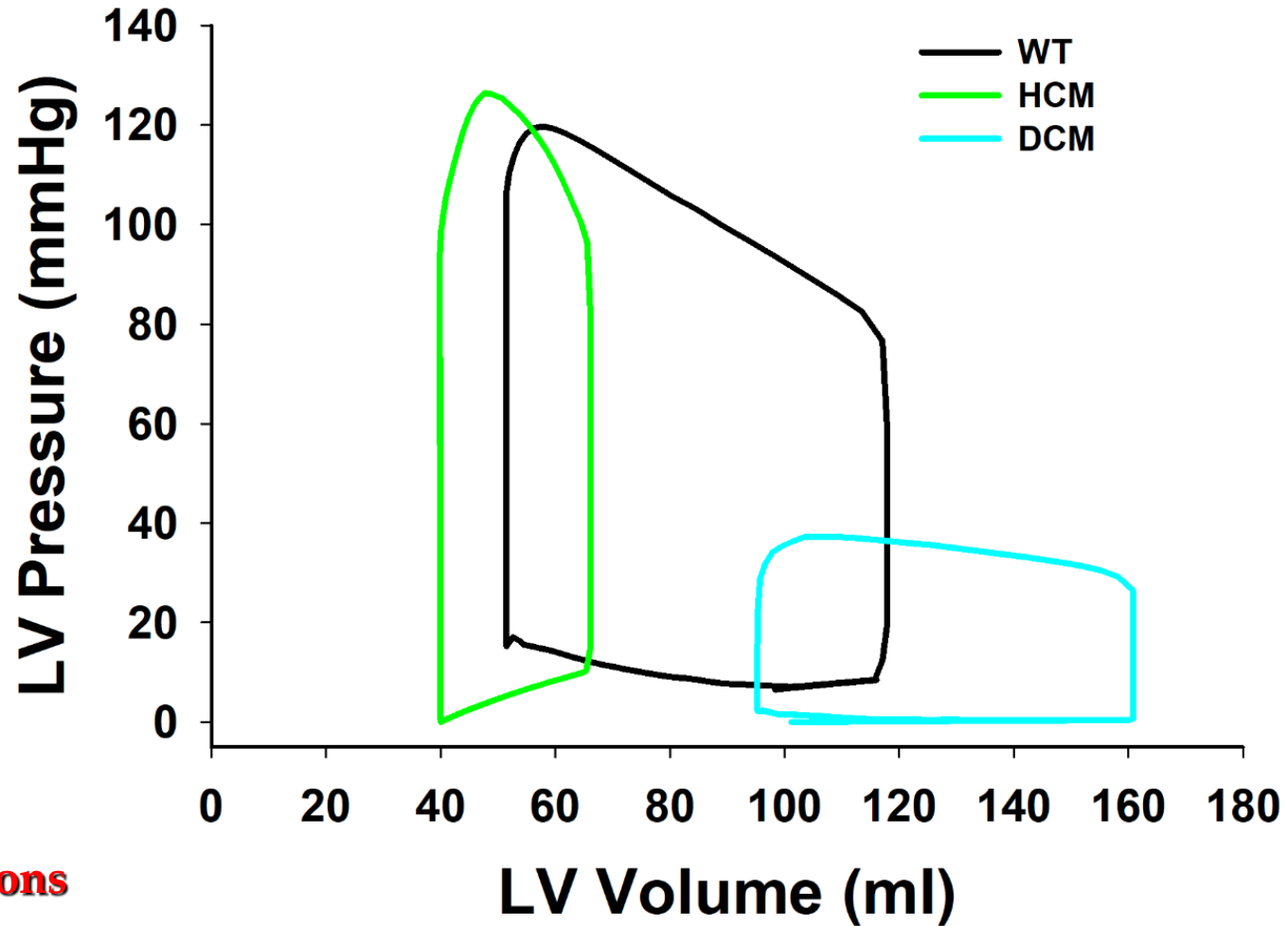
Dilated Cardiomyopathy



Mexie Simulations

Human Left Ventricle





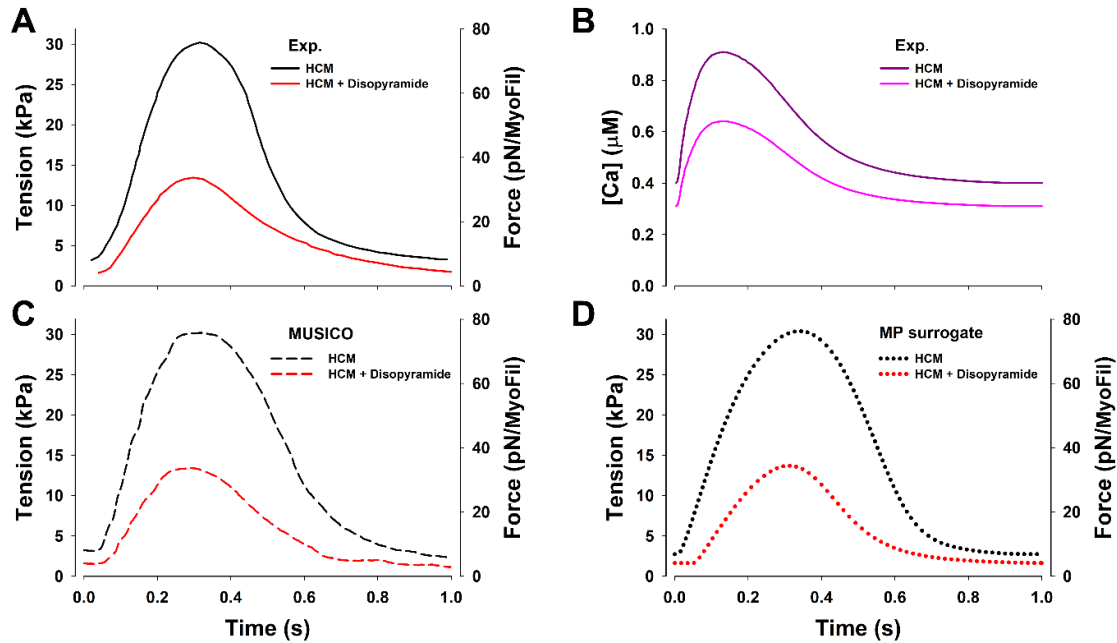
Mexie Simulations



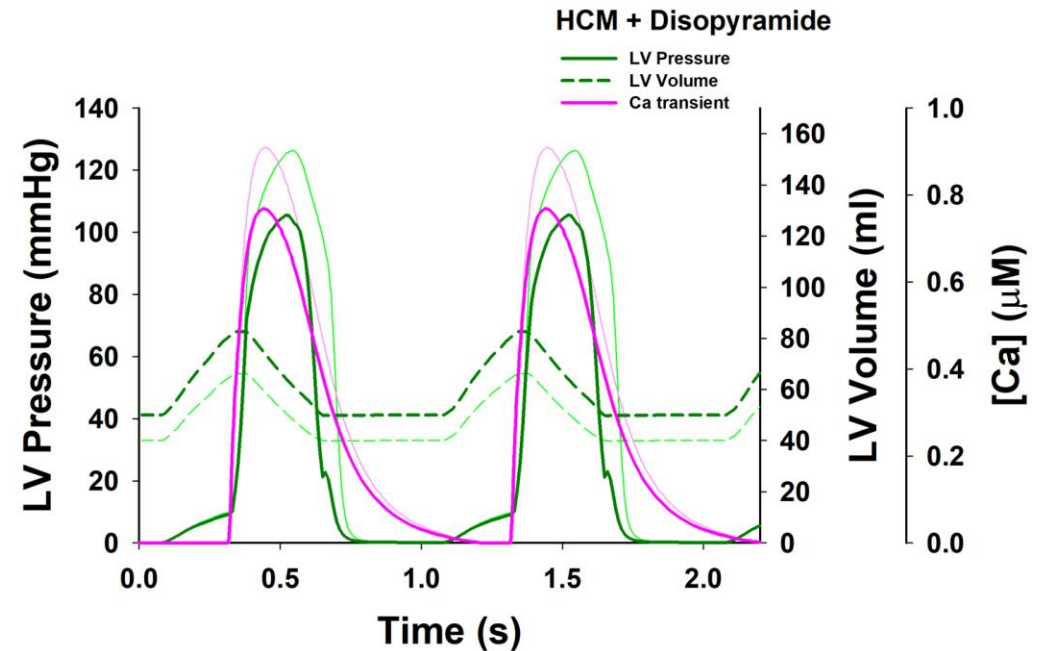
The Effect of Disopyramide on HCM Muscle and Left Ventricle

Modulation of $[Ca^{2+}]$ transients

Human Cardiac Muscle Fiber



Human Left Ventricle



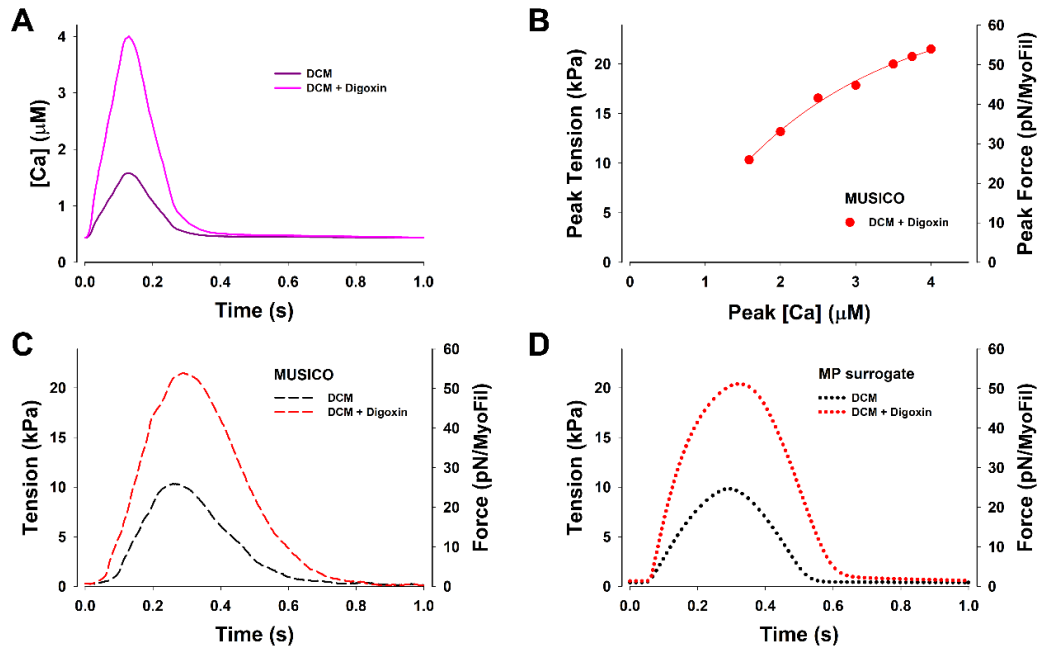
Mexie Simulations



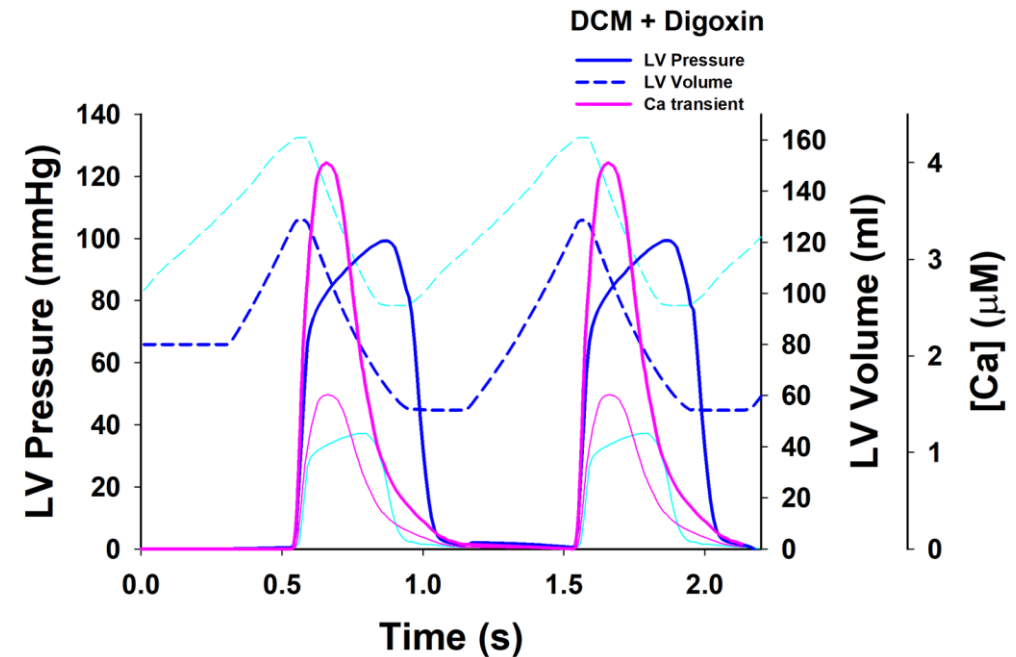
The Effect of Digoxin on DCM Muscle and Left Ventricle

Modulation of $[Ca^{2+}]$ transients

Human Cardiac Muscle Fiber



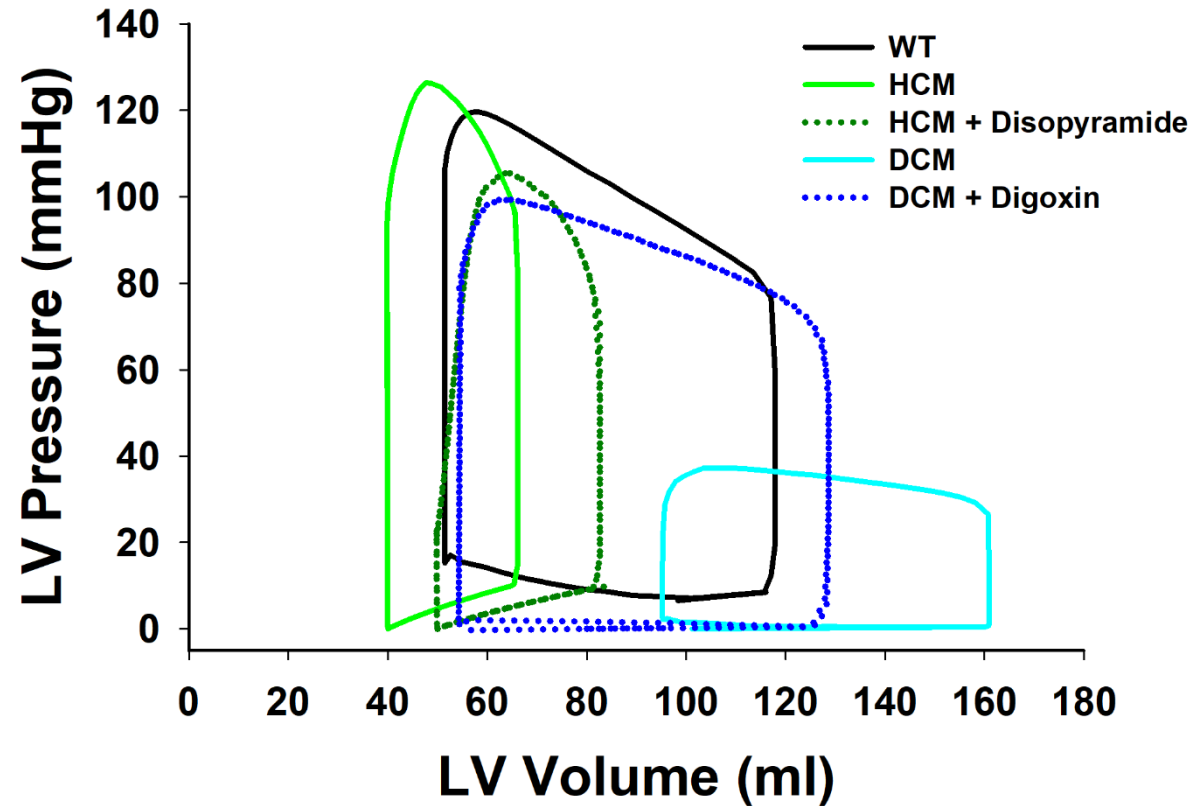
Human Left Ventricle



Mexie Simulations

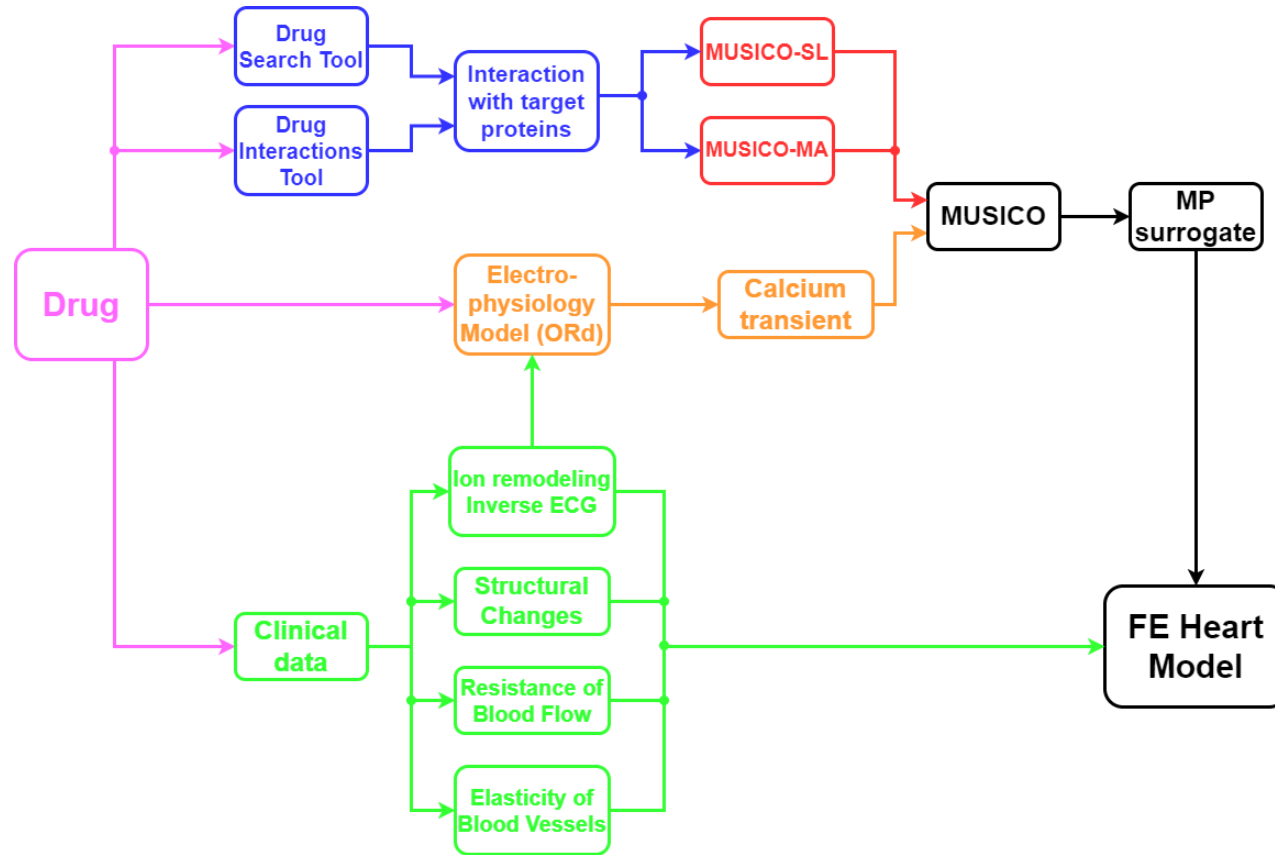


The Effect of Disopyramide and Digoxin on HCM and DCM Left Ventricle Function



Mexie Simulations





3 characteristic pathways of drug flow:

- (i) for drugs acting at the level of contractile proteins;
- (ii) at the level of regulation of transient intracellular calcium concentration;
- (iii) at the level tissue remodeling and/or by modulation of blood vessel elasticity, i.e. resistance to blood flow and cardiac output.

1. Modulation of $[Ca^{2+}]$ transients

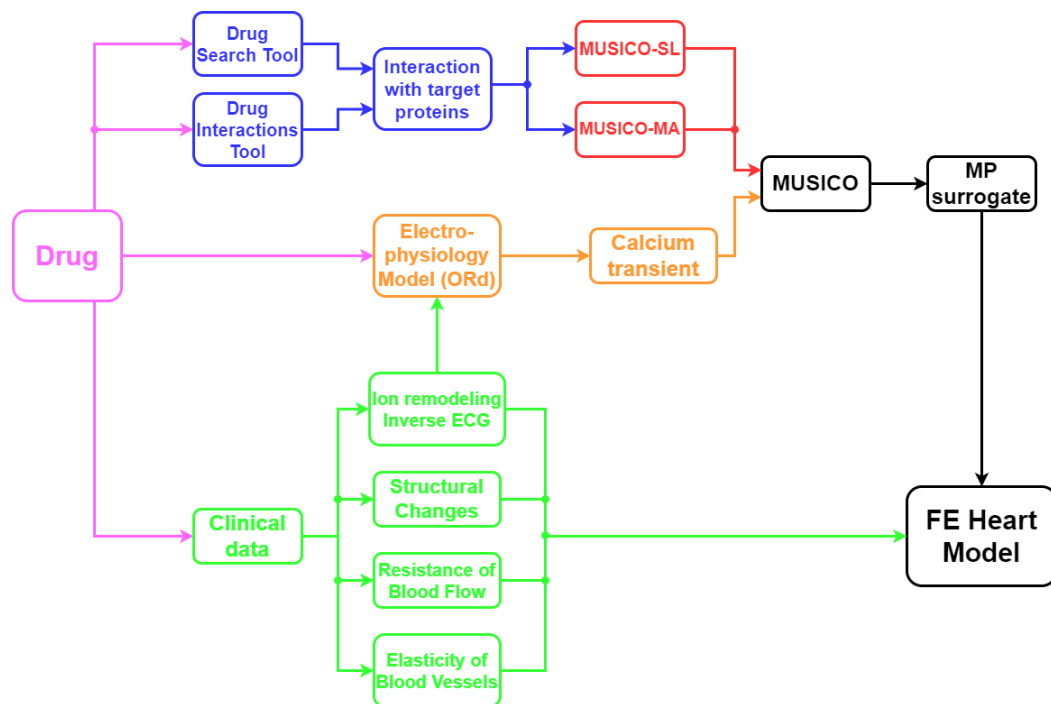
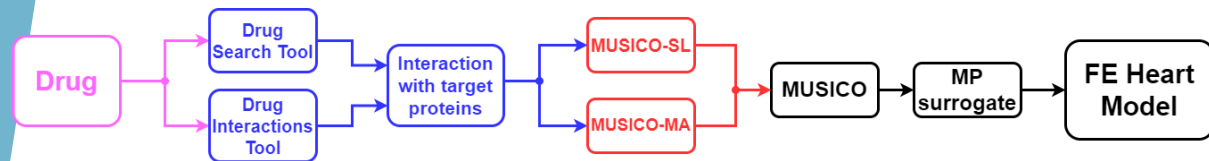
- HCM - Disopyramide, which lowers peak and baseline levels of $[Ca^{2+}]$ transient during twitch contractions
- DCM - Digoxin, which increases peak of $[Ca^{2+}]$ transient during twitch contractions, but does not change time to peak and relaxation time

2. Changes in kinetic parameters

- HCM - Mavacamten, which is associated with regulation of kinetics rates of transition between disordered myosin detached states and ordered parked state
- DCM - dATP, which modulates crossbridge cycle rates

3. Changes in macroscopic parameters

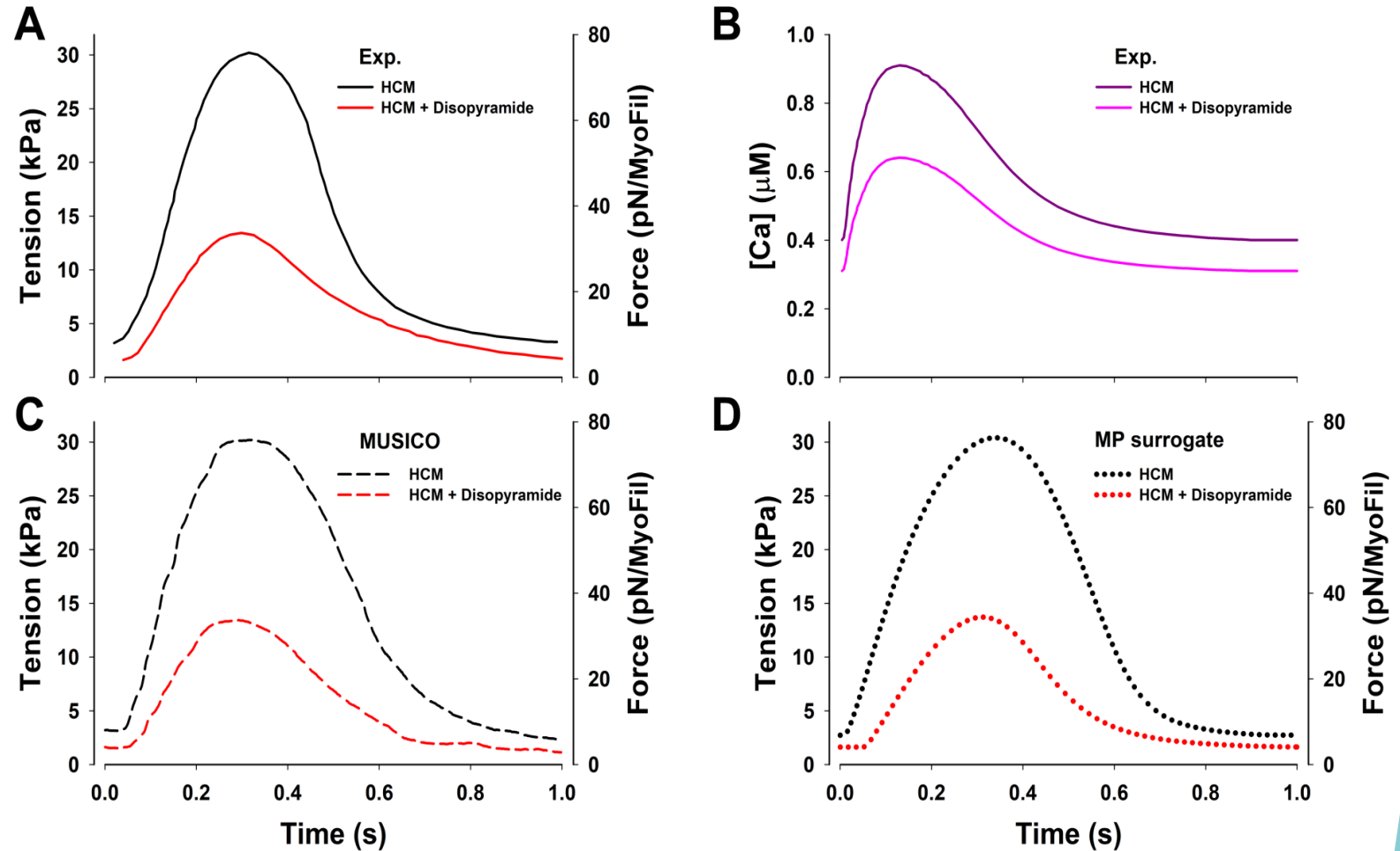
- HCM - Entresto, which acts on remodeling of heart ventricle walls and modulates the elasticity of blood vessels, typically reducing resistance to blood flow and improving cardiac output in HCM



For treating
Hypertrophic Cardiomyopathy (HCM)

Disopyramide lowers peak and baseline levels of $[Ca^{2+}]$ transient during twitch contractions!

All MUSICO parameters are the same!
The only change is in the peak of $[Ca^{2+}]$ transient in the presence of 5 μ M of disopyramide



For treating
Dilated Cardiomyopathy (DCM)

Digoxin increases peak of $[Ca^{2+}]$ transient during twitch contractions but **does not** change time to peak and relaxation time!

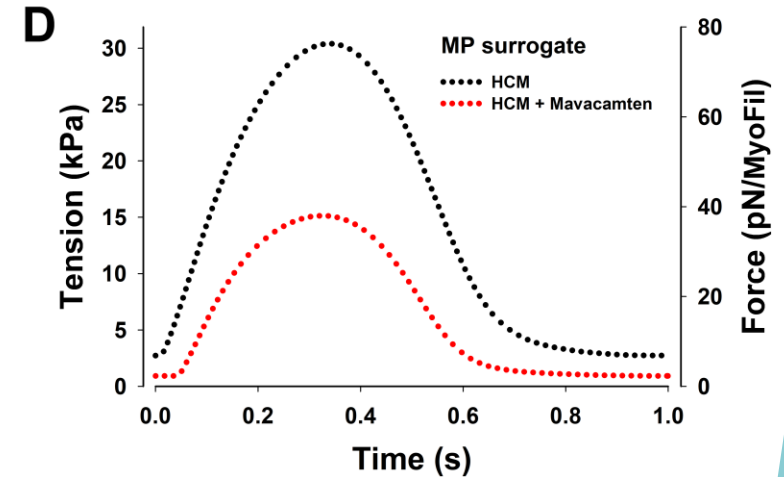
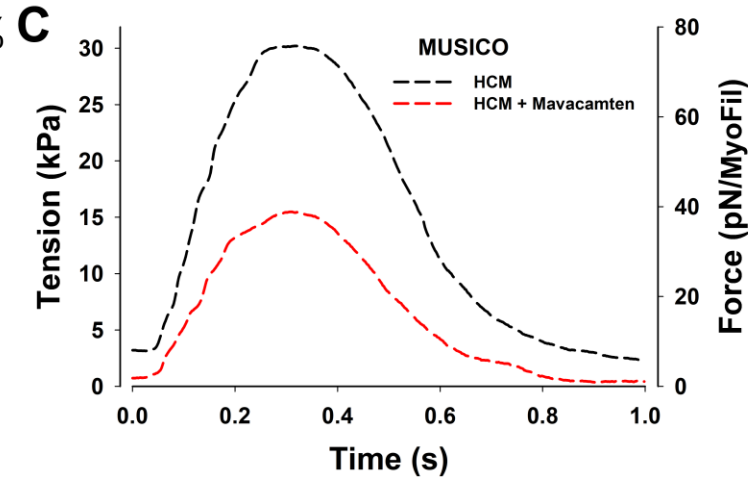
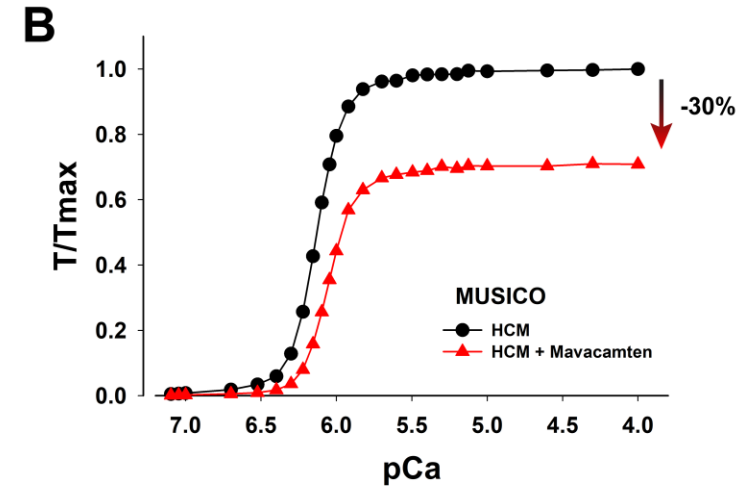
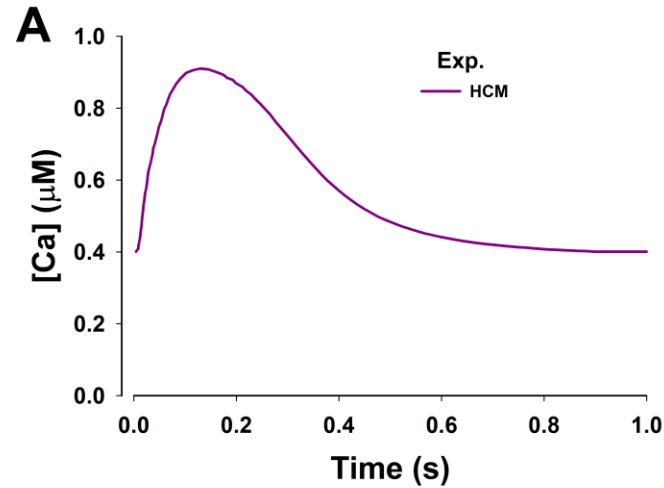
All MUSICO parameters are the same, and the only change is in the peak of $[Ca^{2+}]$ transients

For treating Hypertrophic Cardiomyopathy (HCM)

Mavacamten is associated with regulation of kinetics rates of transition between disordered myosin detached states and ordered parked state!

The 1 μ m Mavacampten decreases tension at full Ca²⁺ activation by 30% and twitch peak for ~ 50 %.

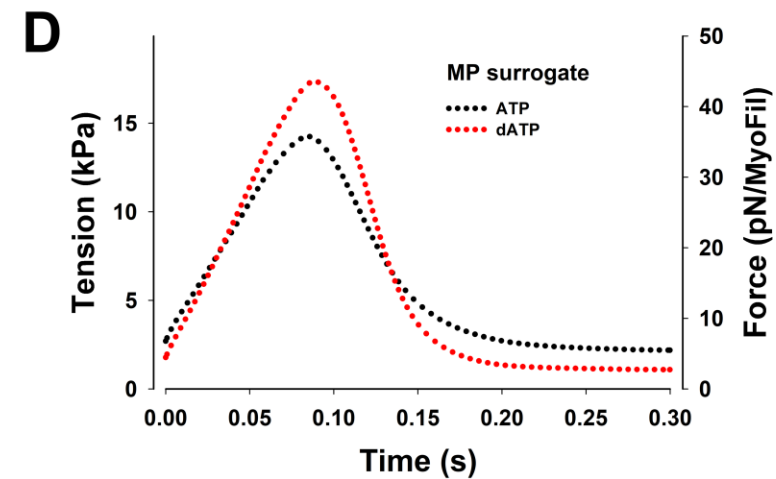
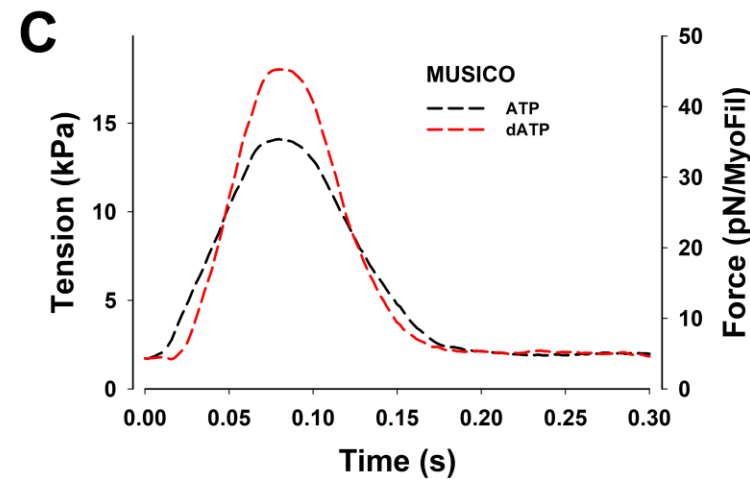
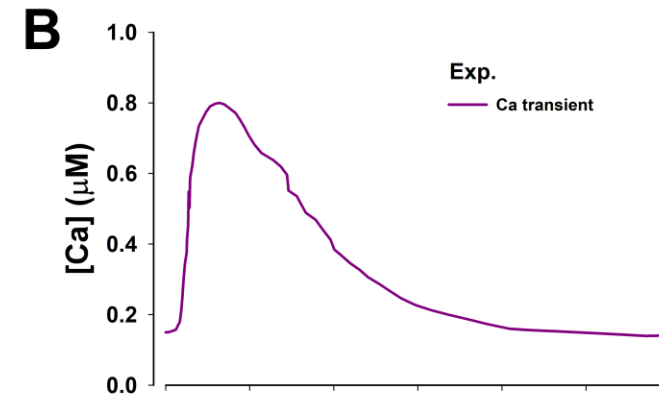
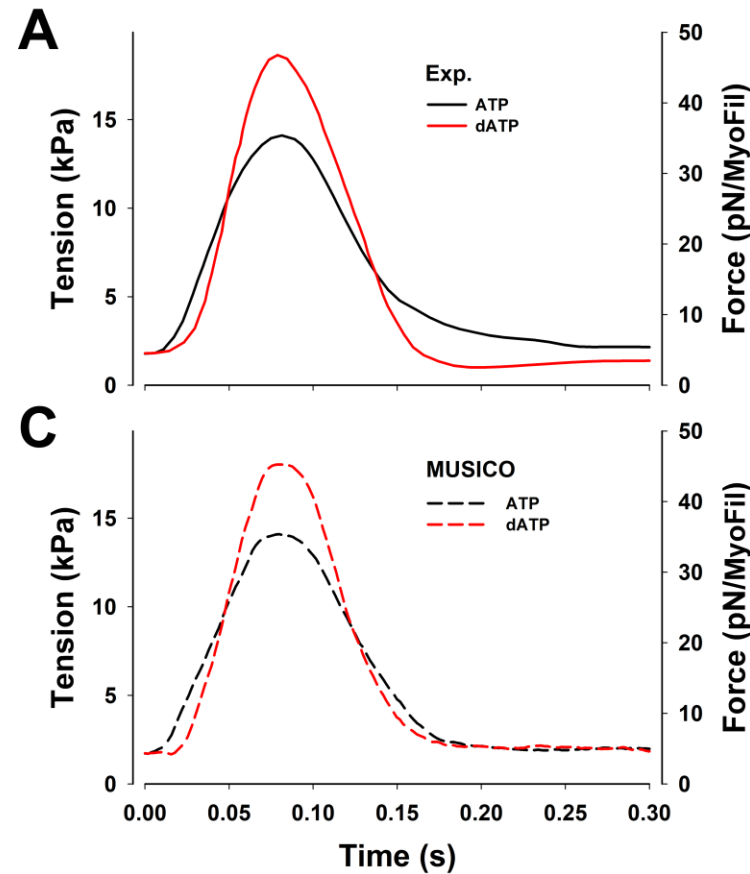
This was achieved by 3.5-fold increase in the transition rate from M.D.Pi to “Parked state”



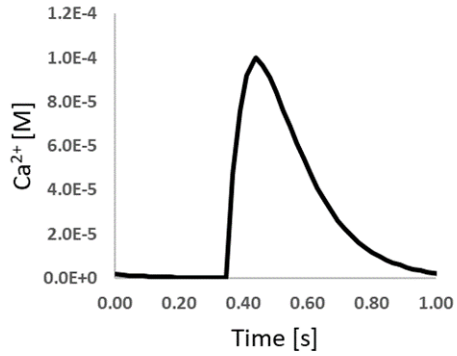
For treating
Dilated Cardiomyopathy (DCM)

dATP modulates crossbridge cycle rates!

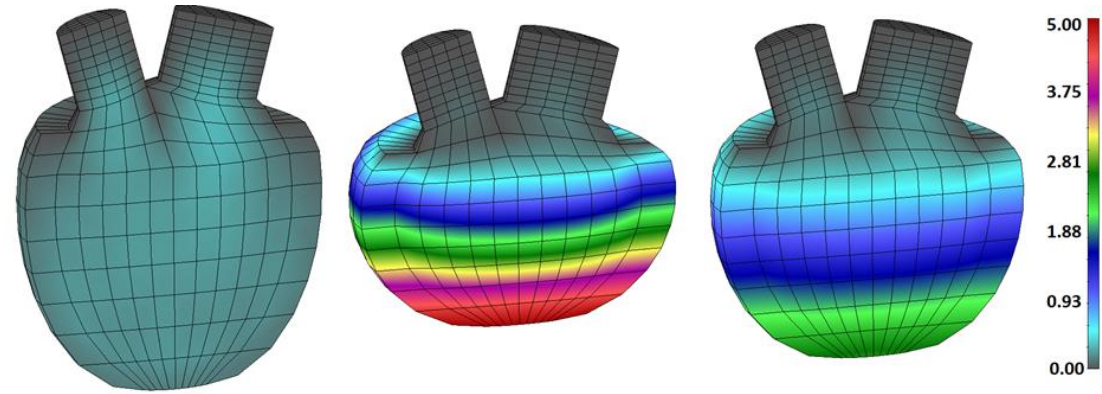
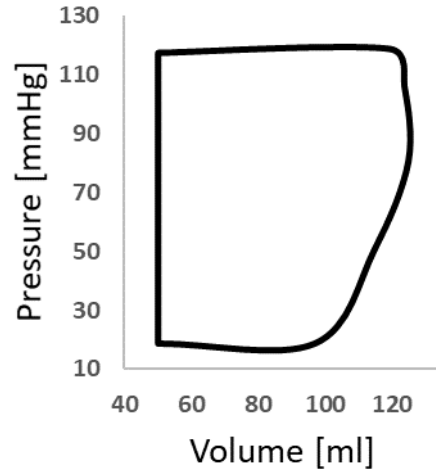
The observed increase in twitch tension peak is achieved by ~3-fold increase in binding rate but keeping binding equilibrium rate constant, and 2-fold increase in ADP release rate.



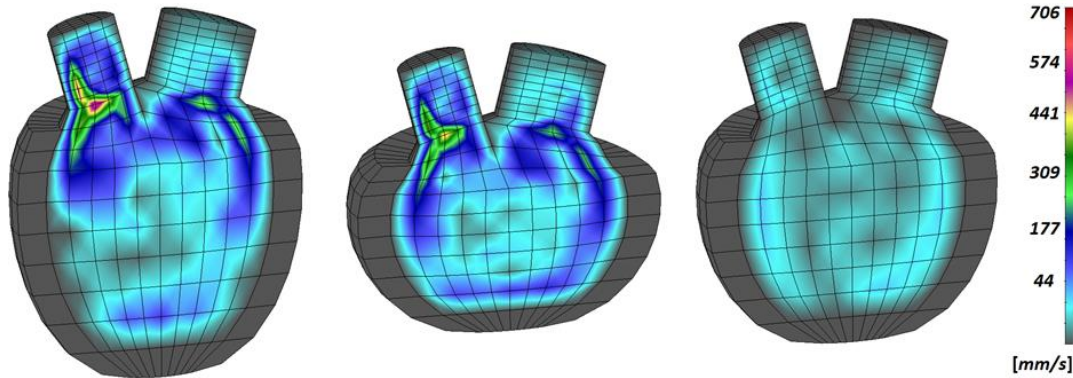
Effects of calcium change



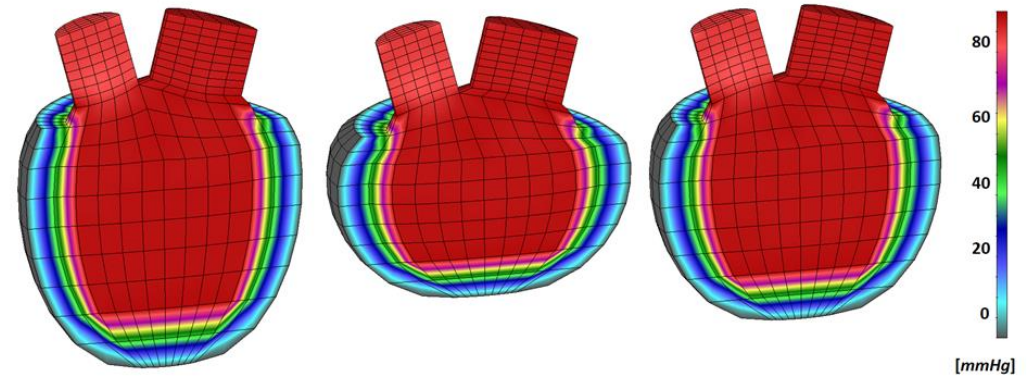
Calcium concentration



Displacement field at 0.2s, 0.5s and 0.6s



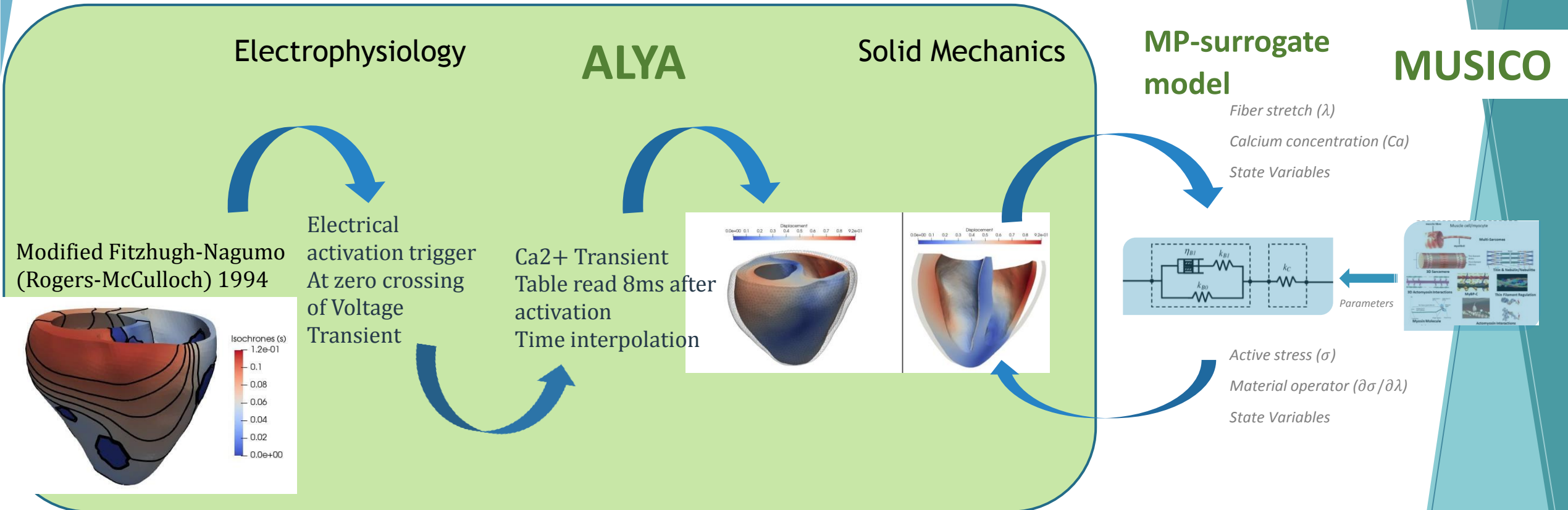
Velocity field at 0.2s, 0.5s and 0.6s



Pressure field at 0.2s, 0.5s and 0.6s

Linking MUSICO and FE simulation ALYA

- ▶ The coupling of Alya and MP-surrogate was extended to a human heart biventricular anatomy

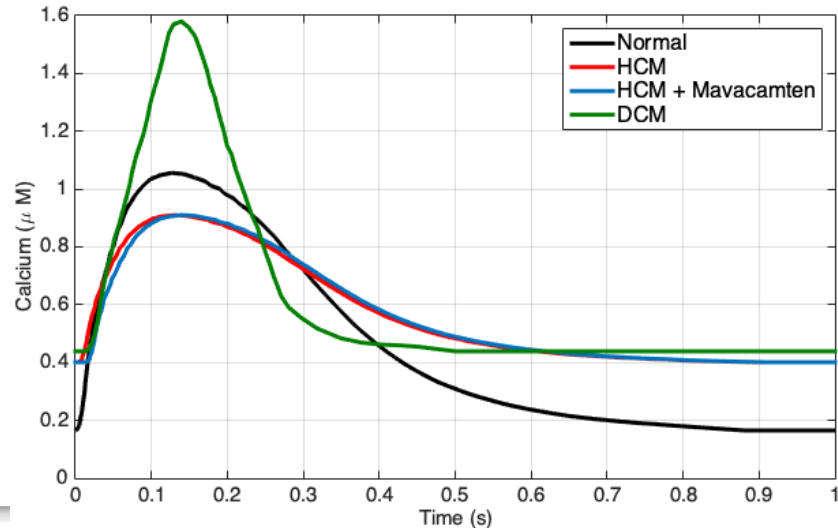


Integration of MP-surrogate into Alya finite element solver

WP5 Alya - MP surrogate Coupling

Data input to both Calcium Transients and MP-surrogate parameters are read and integrated within the ALYA FEM solver

With this setup, any normal, diseased or drug-treatment condition can be simulated in any given anatomy or geometry



```
slab.dat
slab.dom.dat
slab.ker.dat
slab.exm.dat
slab.sld.dat
slab.post.alyadat
MP-params.dat
MP-Ca.dat
msh
```

```
PHYSICAL_PROBLEM
ECCOUPLING
MATERIAL: 1
MODEL: MUSICO
MUSICO_OPTIONS
CALCIUM_FILE: MP-Ca.dat
PARAMETERS_FILE: MP-params.dat
END_MUSICO_OPTIONS
END_ECCOUPLING
END_PHYSICAL_PROBLEM
```

a) Alya's configuration files and ket.dat.

```
38
1.0e-6
5000
1.6
2.2
1.1
1.6
0.176
1.62e5
0.007
0.915
0.0
553.701
100.0
150.0
64.1084910194011
...
| Number parameters
| TimeStep
| IterMax
| SL_0
| SL_isom
| LA
| LM
| B
| R_T_0
| x0
| Ca_50 (uM)
| K_on_0
| K_on_Ca
| K_off_0
| K_off_Ca
| f_0_p
```

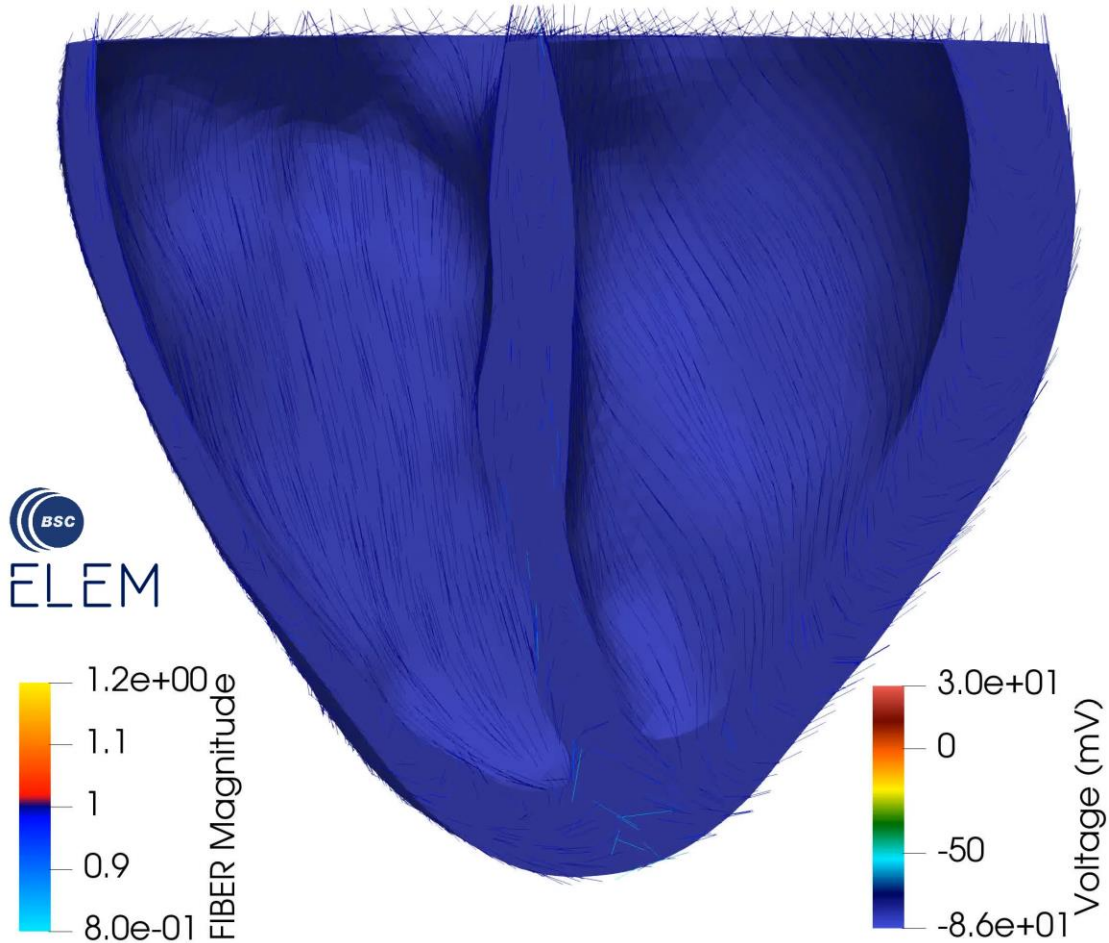
b) MP input parameters (params.dat).

Interface defining the Alya-MP surrogate model

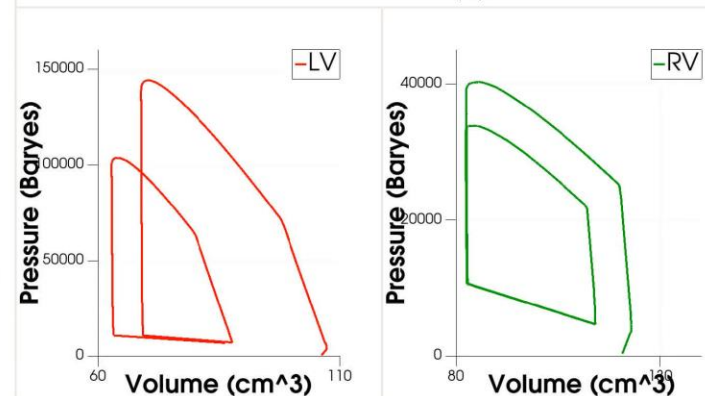
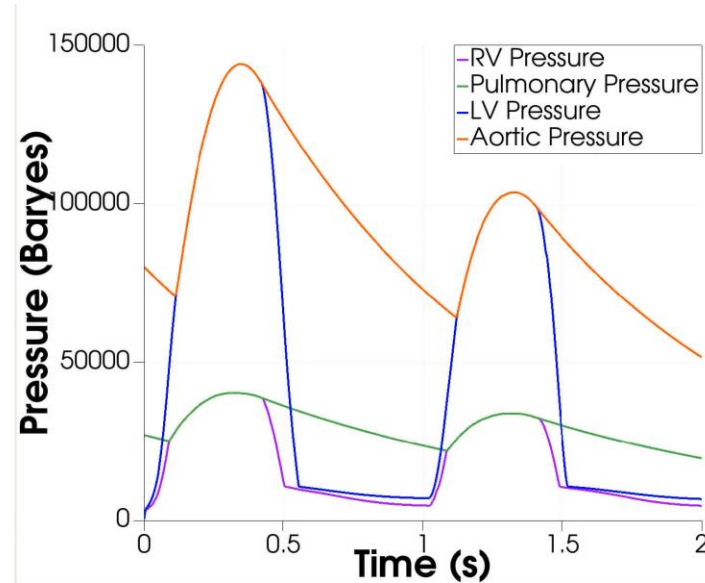


Normal Human Heart

Time: 0.000000

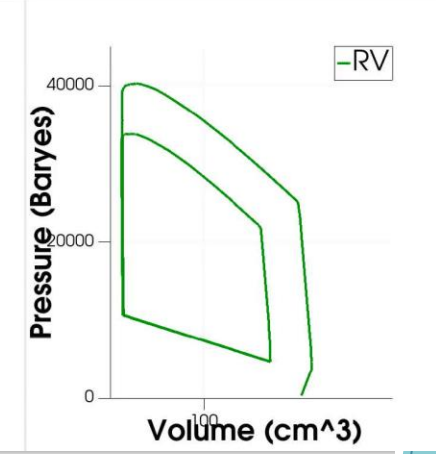
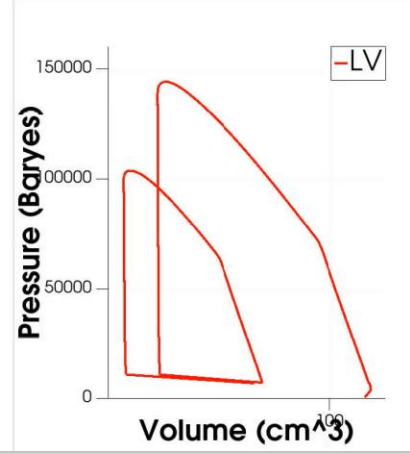
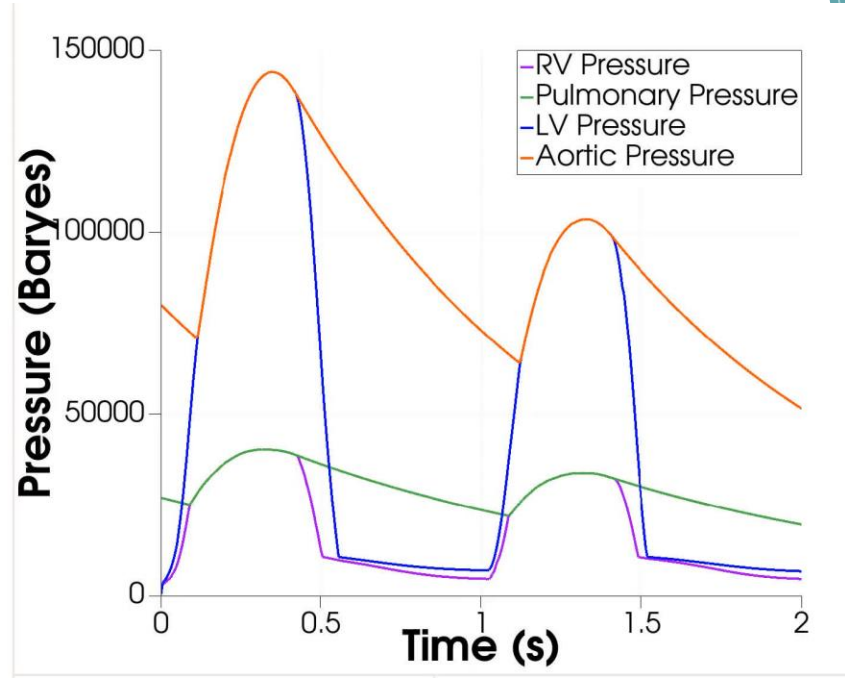
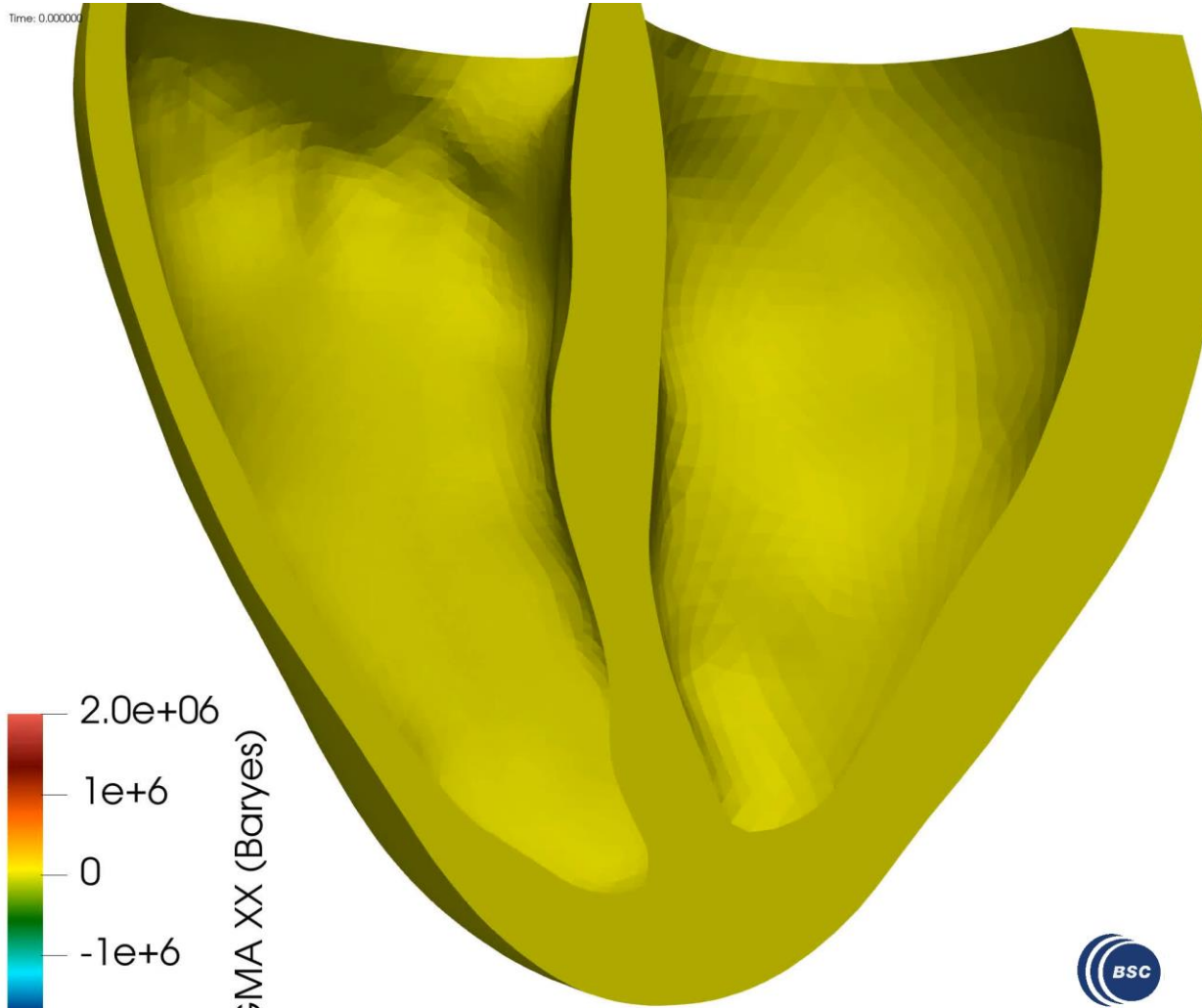


BSC
ELEM

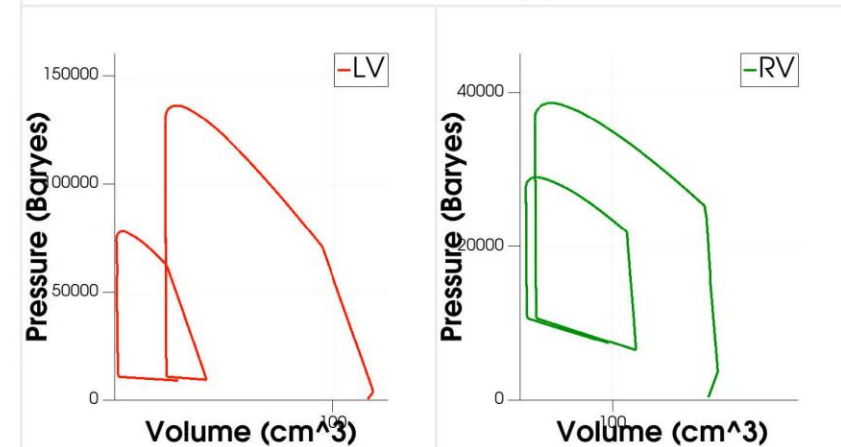
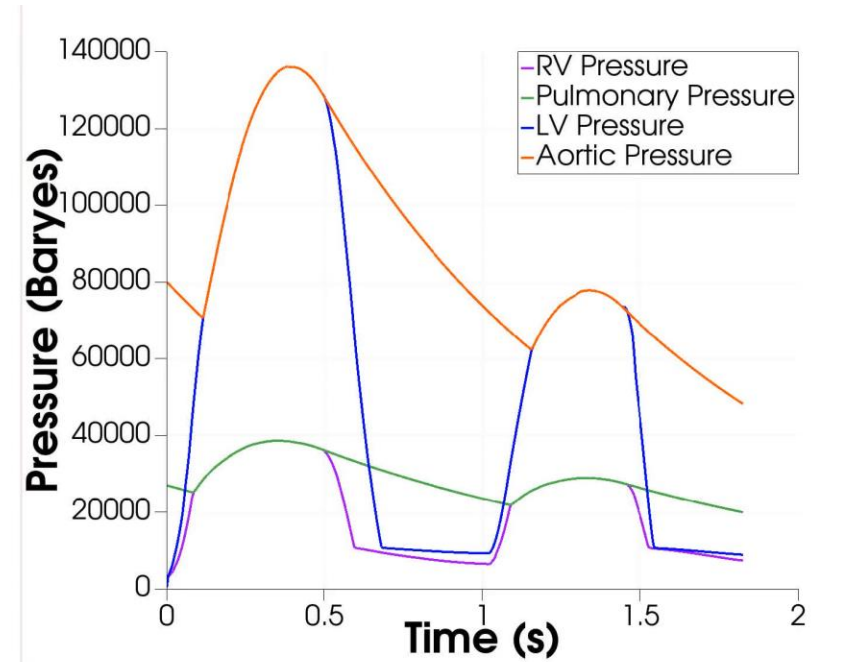
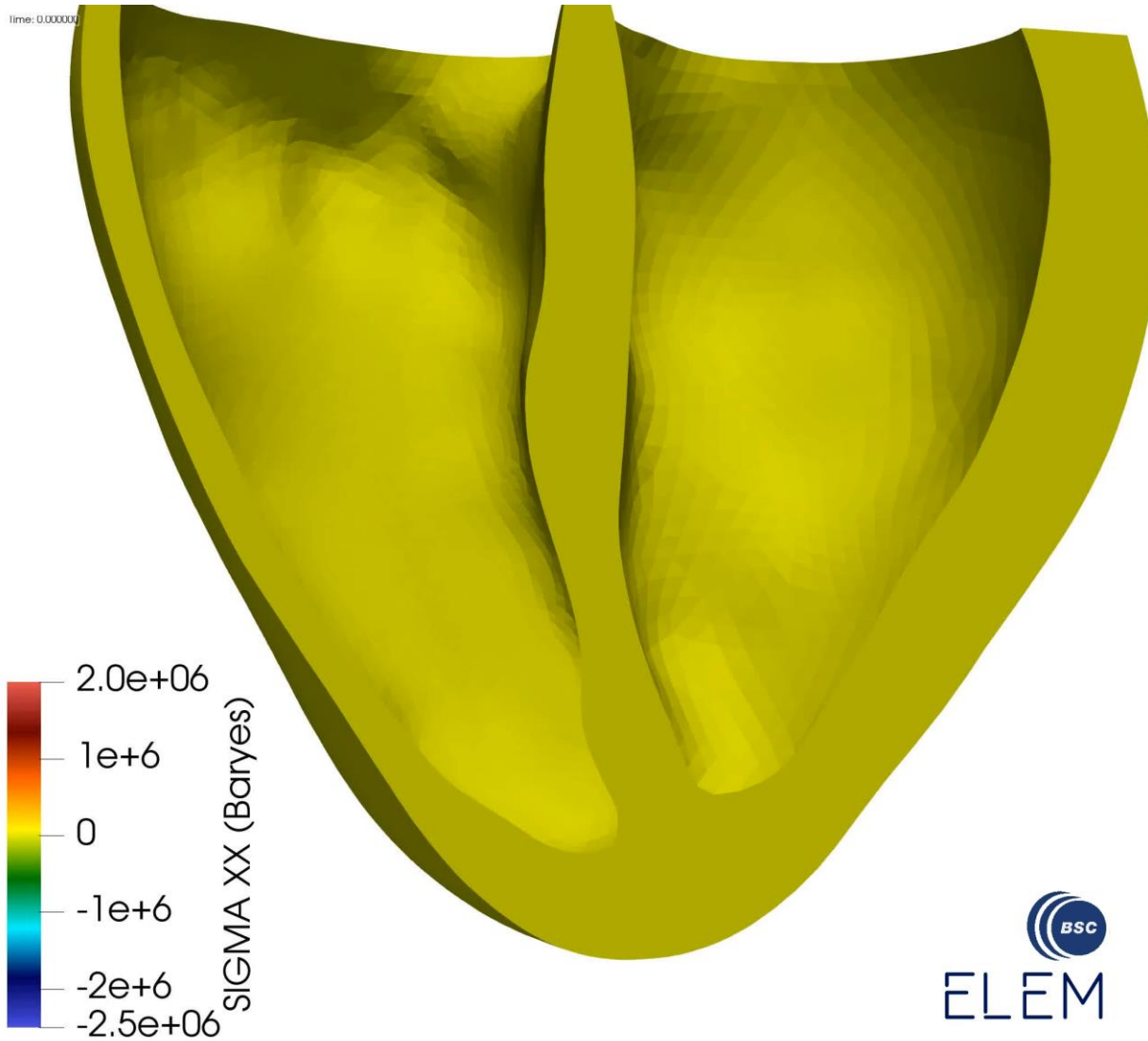


	LV	RV
WK resistance (dyn s/cm ⁵)	3400	750
WK capacitance (cm ⁵ /dyn)	0.00027	0.00156
Diastolic P (baryes)	8000 (6 mmHg)	4000 (3 mmHg)
Valve Opening P (baryes)	80000 (60 mmHg)	27000 (20 mmHg)

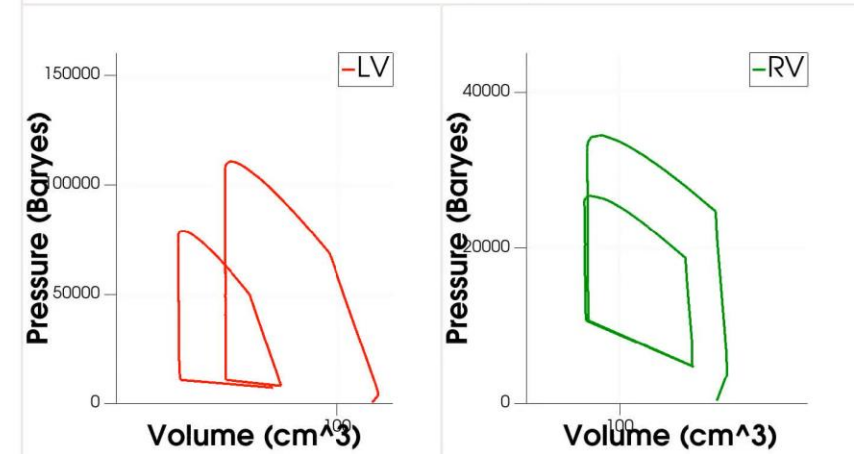
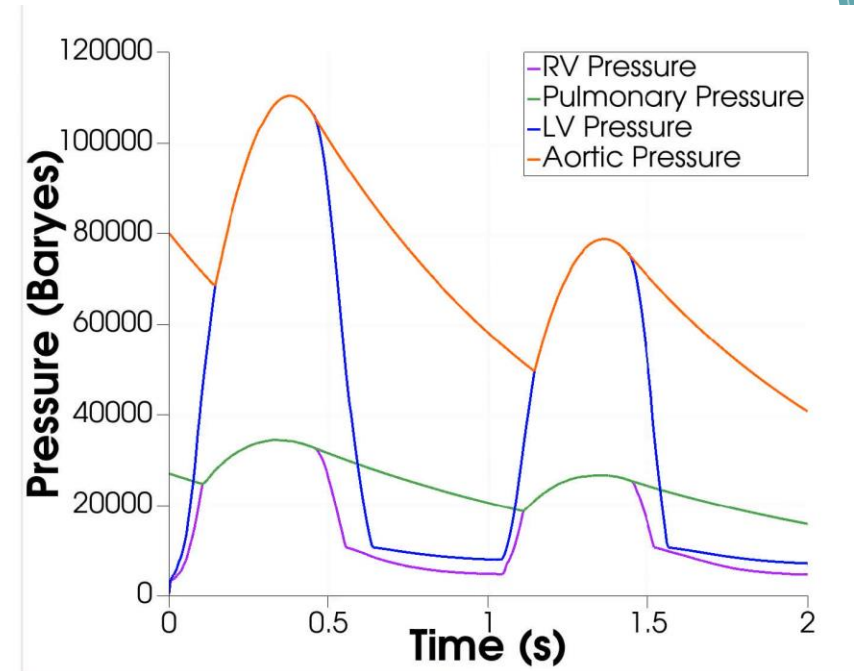
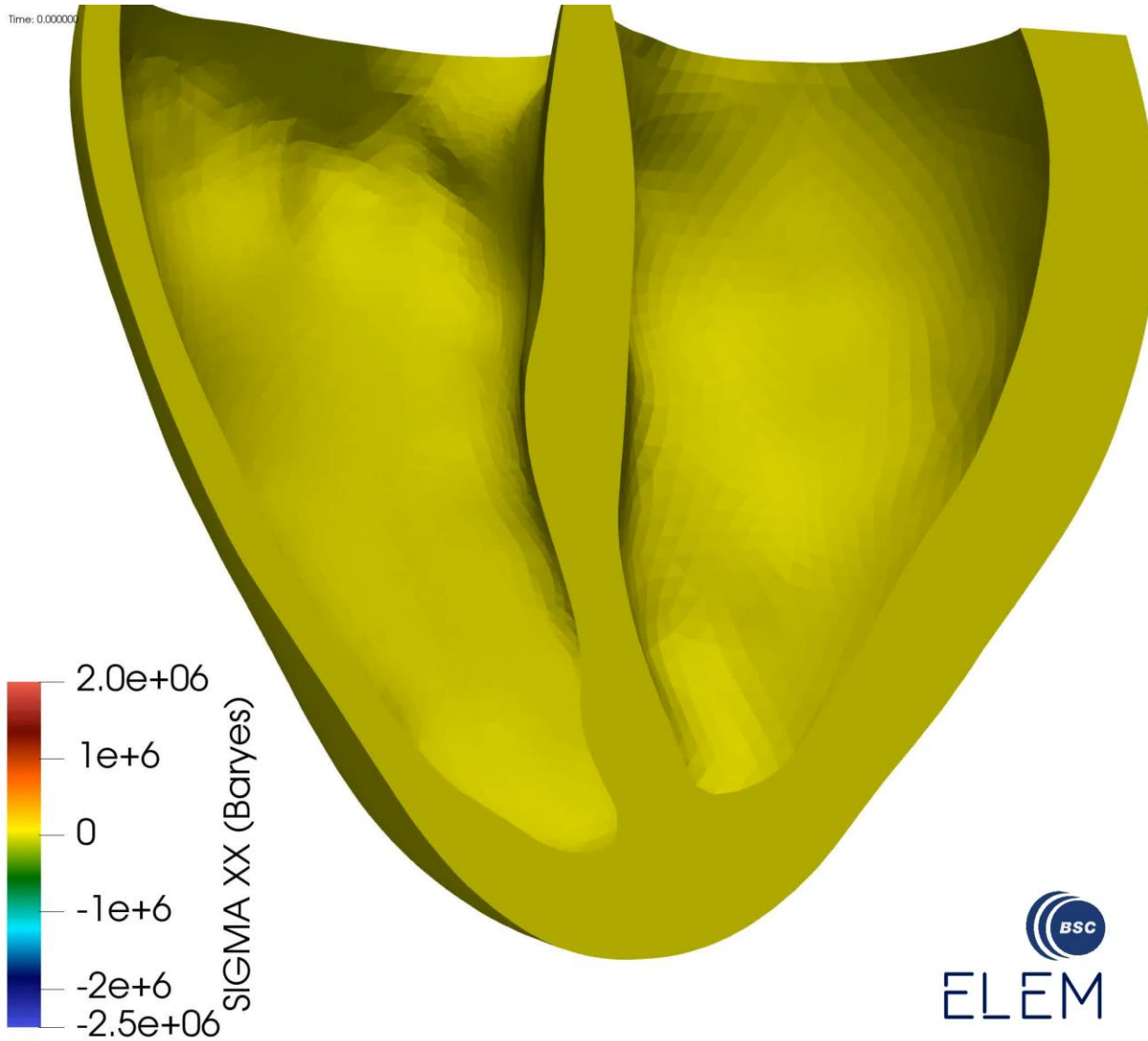
Normal Human Heart - Stress



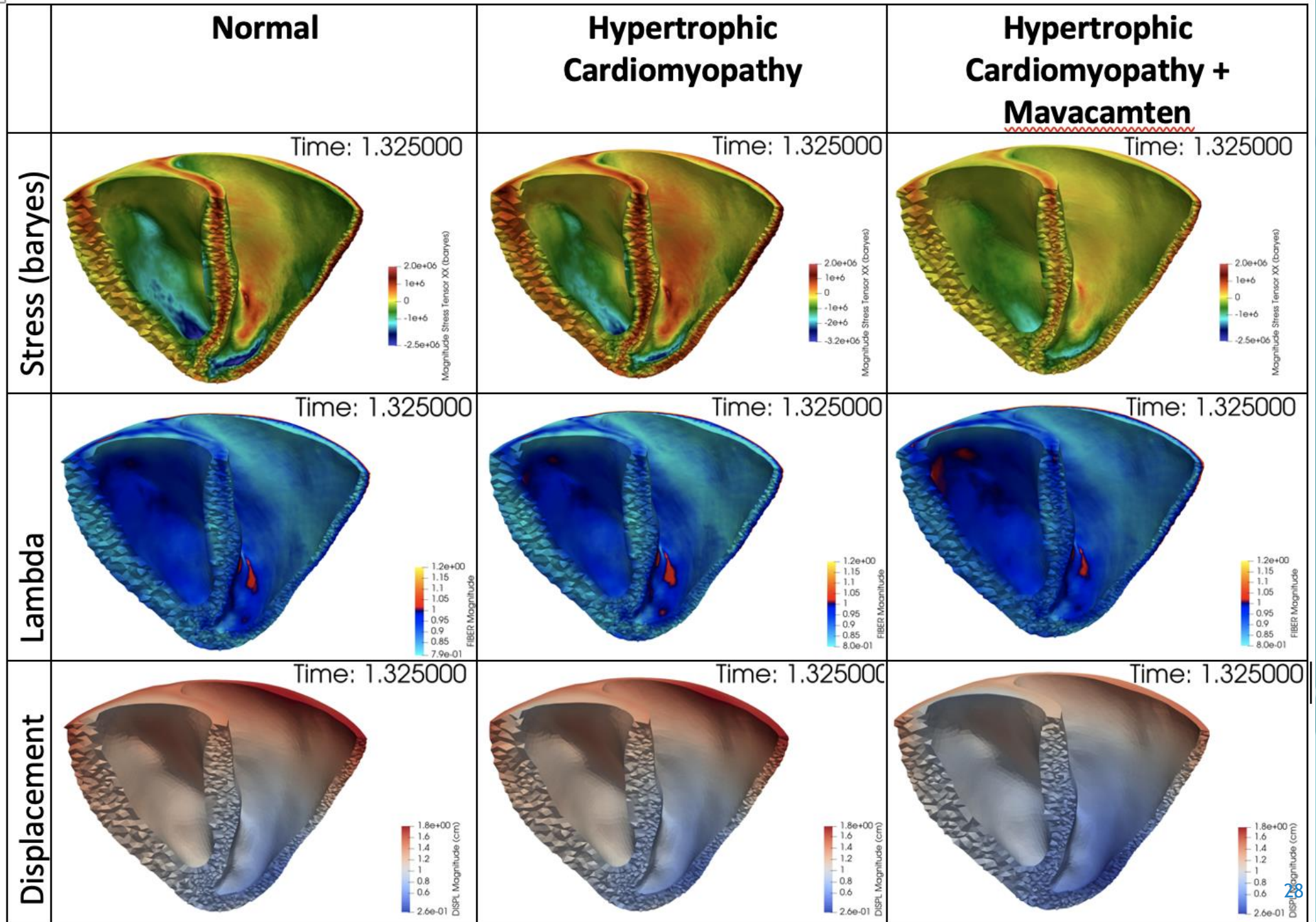
Hypertrophic Cardiomyopathy



HCM + Mavacamten



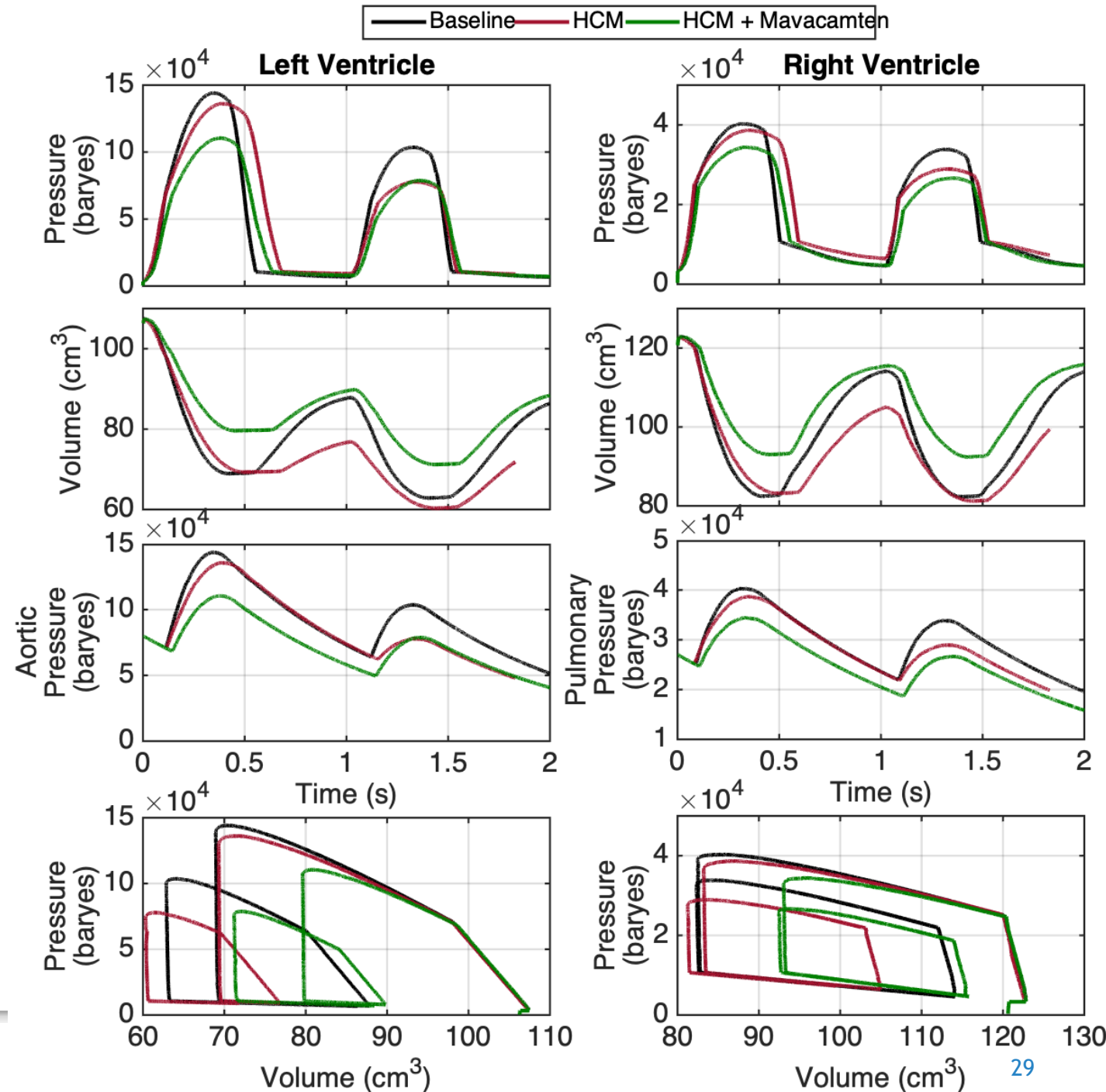
Mavacamten reduced the myocardial stress



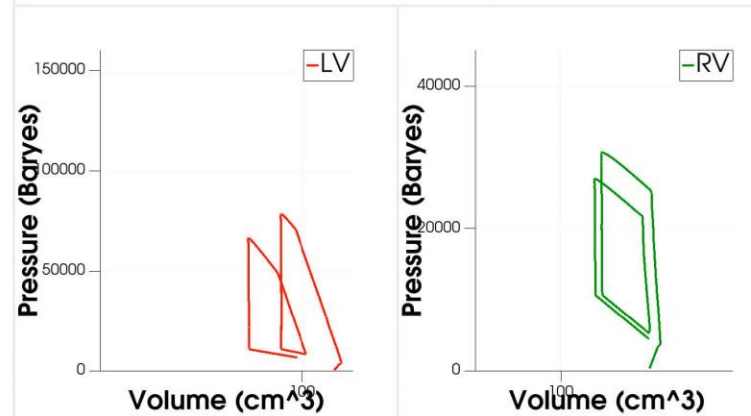
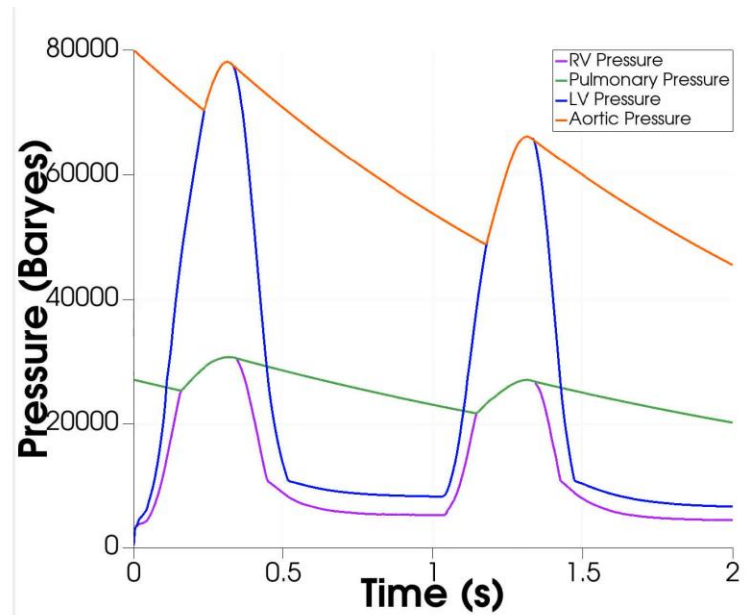
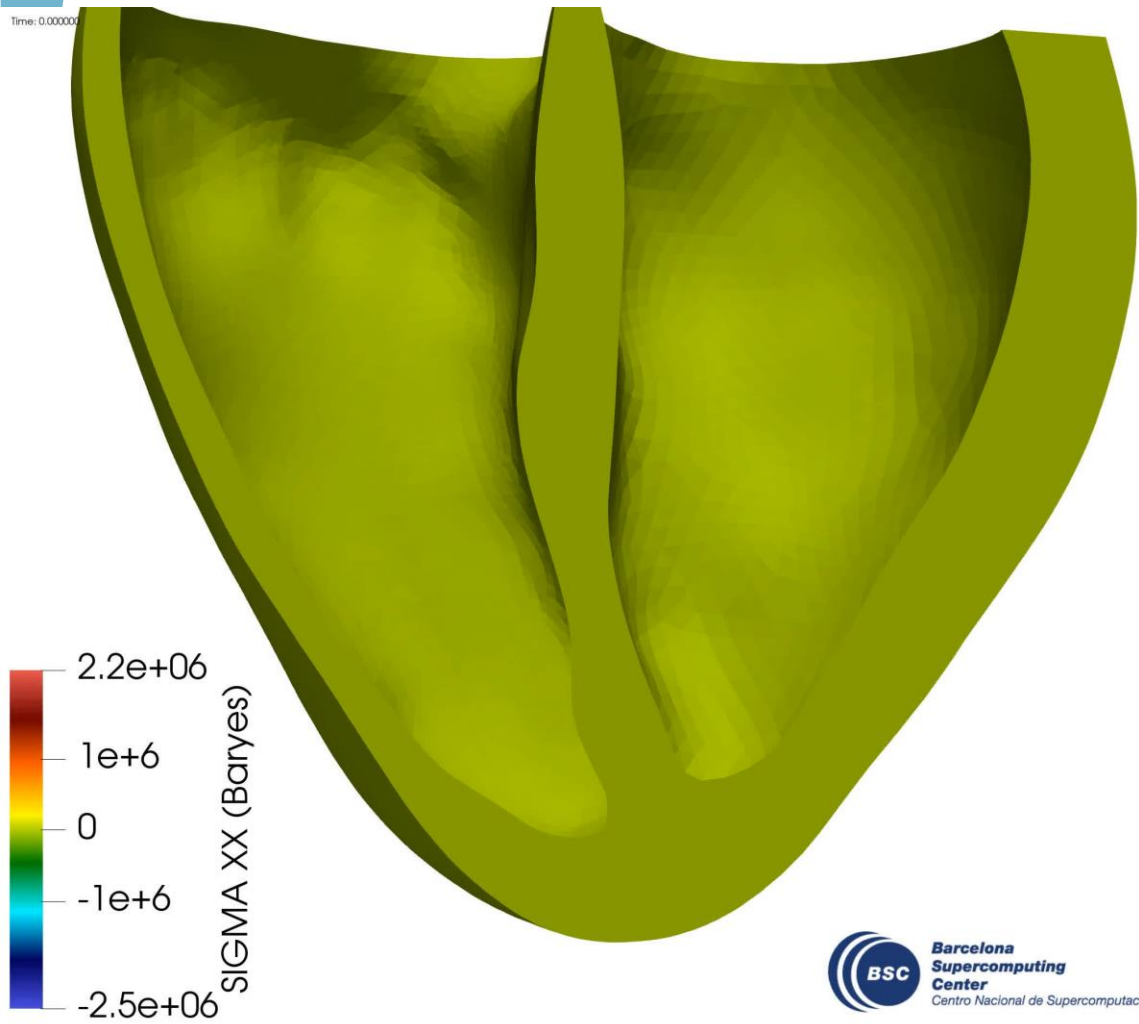
Pressure-Volume Loop Comparison between models

- ▶ Full heartbeat simulations require simulation of more than one beat to reach a steady state
- ▶ Baseline calcium transient magnitude pre-stresses the anatomy
- ▶ There is a need to pre-stress the anatomy so as to preserve initial diastolic volume
- ▶ Mavacamten slightly reduced arterial pressure

Percentage change from Normal	LV EF (%)	RV EF (%)
HCM	-25%	-15%
HCM + Mavacamten	-29%	-26%



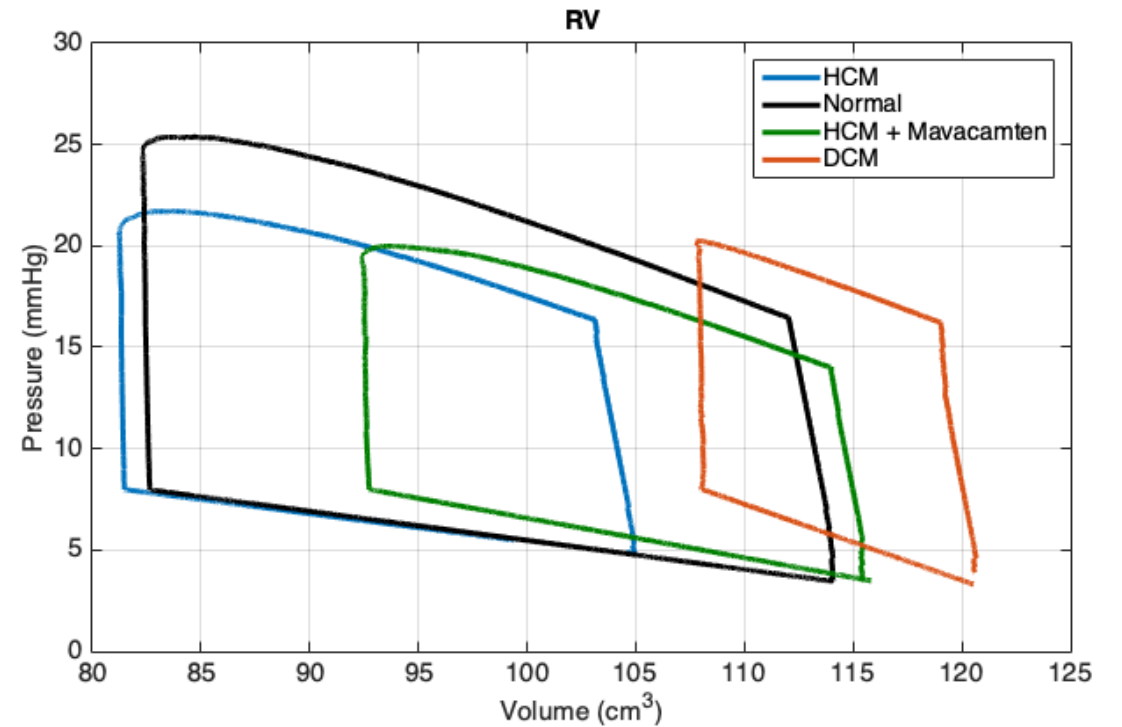
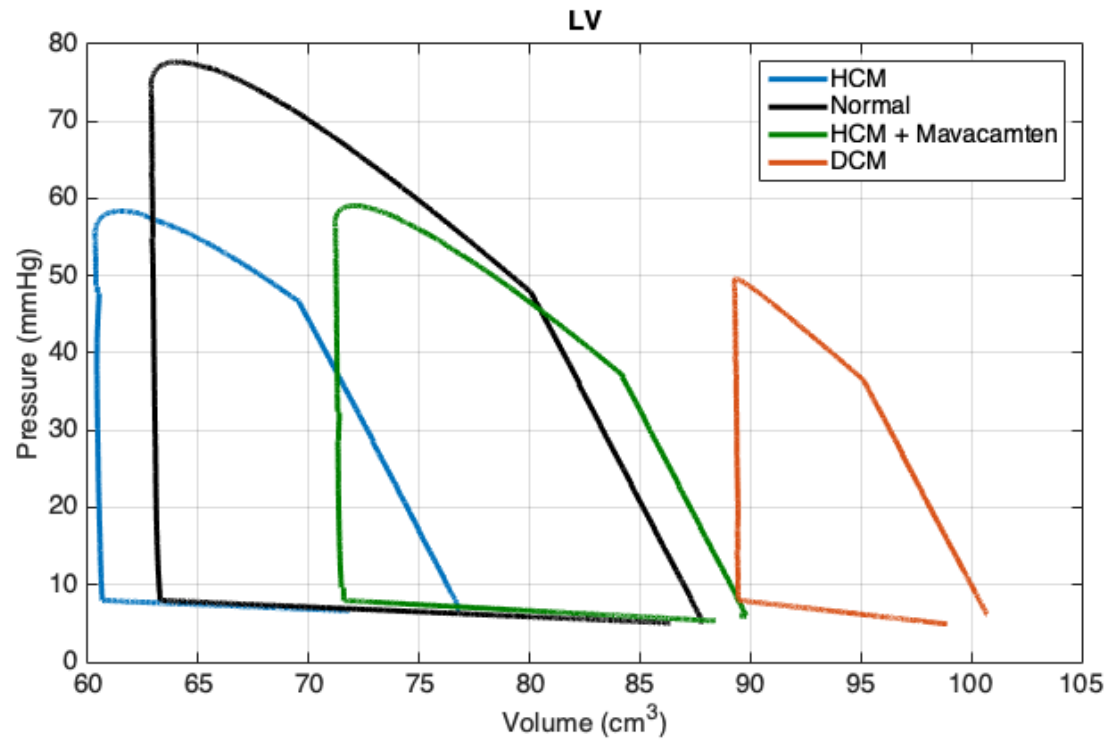
Dilated Cardiomyopathy



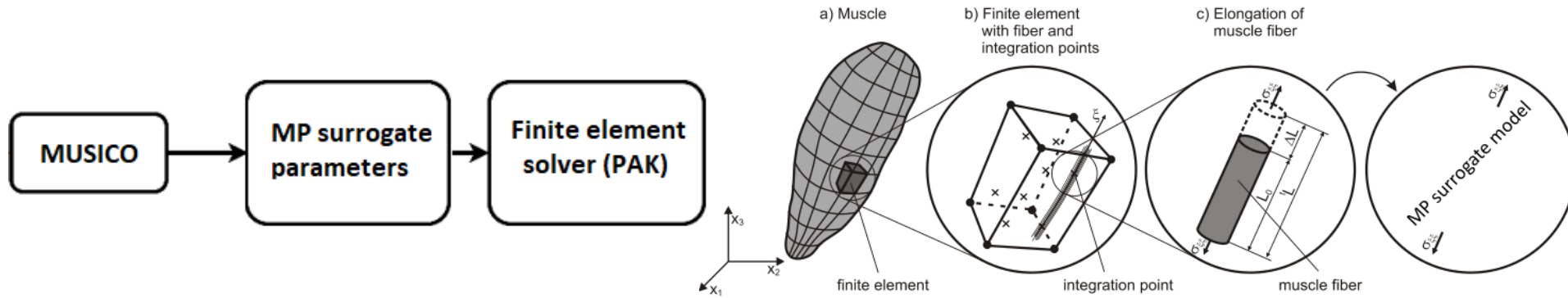
	LV	RV
WK resistance (dyn s/cm ⁵)	6800	1500
WK capacitance (cm ⁵ /dyn)	0.00027	0.00156
Diastolic P (baryes)	8000 (6 mmHg)	4000 (3 mmHg)
Valve Opening P (baryes)	80000 (60 mmHg)	27000 (20 mmHg)



Pressure-Volume loops



PAK FE solver tool with linked MP surrogate model



Data flow of the pak-musico integration

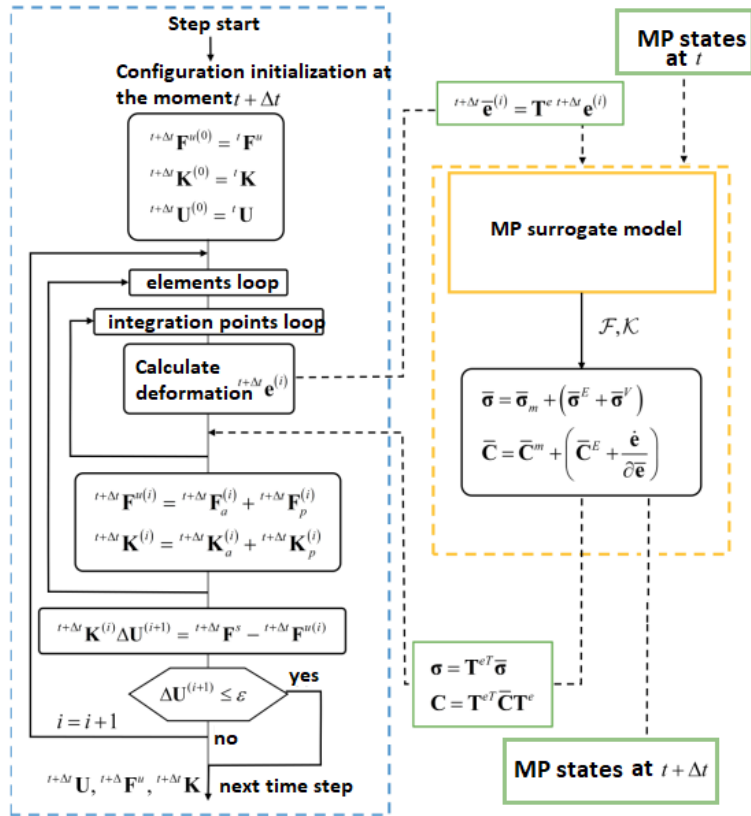
Multi-scale model of muscle contraction.

- a) Muscle discretized into finite elements,
- b) Muscle fiber within the finite element and integration points,
- c) deformation of the muscle

- ▶ MP surrogate was built into our finite element solver PAK as a new muscle material model. MP surrogate consists of parameters, states, and calculator.
- ▶ Based on input parameters, the current state of the material model and provided stretch, MP surrogate calculates stress and instantaneous stiffness along muscle fiber and it produces a new state of the MP

D5.4 Software: Linking MUSICO and FE simulation

PAK FE solver tool with linked MP surrogate model

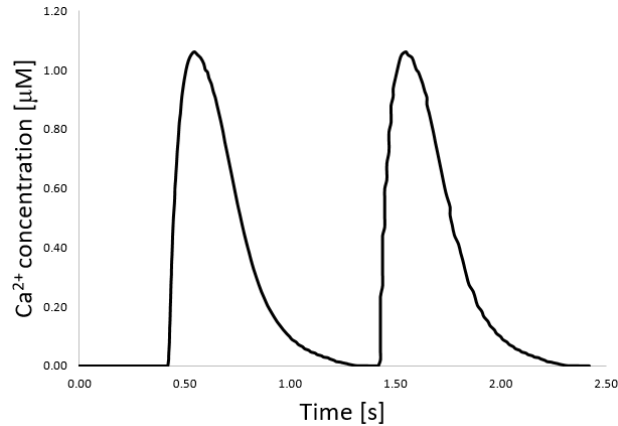


Algorithm: Finite element analysis and MP surrogate model

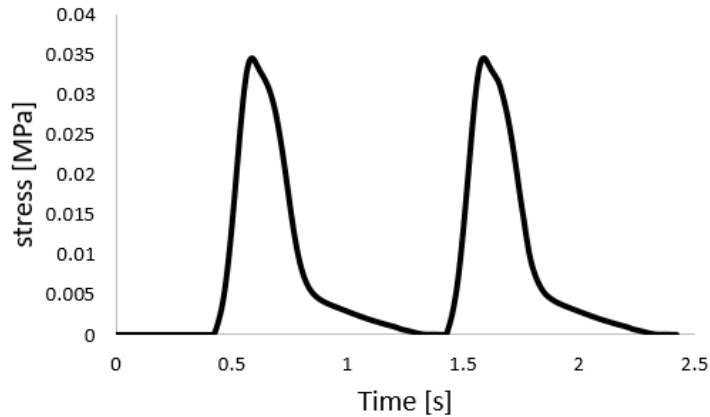
- ▶ Finite element solver maintains and updates states of the MP model. We accept the new state of the model if the finite elements achieved convergence. We neglect the new state and use the state from the previous time step if convergence is not achieved.
- ▶ In our code, we incorporated openMP, which is typically used for loop-level parallelism, to speed up the calculations of integrated PAK-MP simulations.
- ▶ OpenMP introduces parallelism into the application by launching a set of threads that execute portions of code concurrently. Since MP calculations are computationally intensive we created one thread per integration point, so that the calculations done at each integration point are done in parallel.

PAK linked with MP - Use cases

► Cube model - Healthy muscle



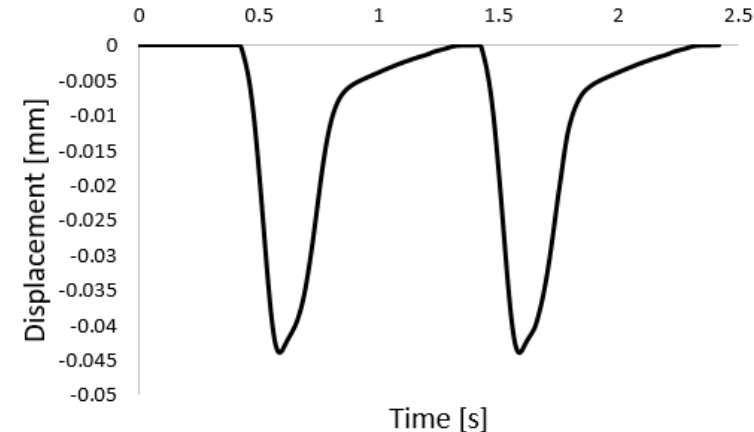
Prescribed calcium concentration for a healthy heart



Active stress generated within muscle fiber during contraction

Table MP model parameters for a healthy heart

Parameter	Value	Parameter	Value	Parameter	Value
<i>TimeStep</i>	1.00E-05	<i>k_off_Ca</i>	50	<i>ErrFlag</i>	0
<i>IterMax</i>	100	<i>f_0_p</i>	1000	<i>Stiff_Eq_P1</i>	197.5442
<i>SL_0</i>	1.6	<i>h_0</i>	5000	<i>Stiff_Eq_P2</i>	3434.963
<i>SL_isom</i>	1.9	<i>h_0_p</i>	550	<i>Stiff_Eq_P3</i>	0
<i>LA</i>	1.1	<i>g_0</i>	450	<i>Ca_amp</i>	3.380394
<i>LM</i>	1.6	<i>u</i>	1.1	<i>tau1</i>	0.065917
<i>B</i>	0.176	<i>w</i>	1	<i>tau2</i>	0.014666
<i>R_T_0</i>	1.62E+05	<i>v</i>	1	<i>k_PS_0</i>	50
<i>x0</i>	0.007	<i>beta</i>	0	<i>k_PS_max</i>	700
<i>Ca_50</i>	0.915	<i>eta</i>	0.396	<i>b_param</i>	5
<i>k_on_0</i>	0	<i>sigma_p</i>	7.2	<i>Ca_50_PS</i>	1
<i>k_on_Ca</i>	120	<i>sigma_n</i>	1	<i>k_lambda_on_0</i>	3750
<i>k_off_0</i>	100	<i>ErrorEps</i>	1.0E-7	<i>k_lambda_off_0</i>	375

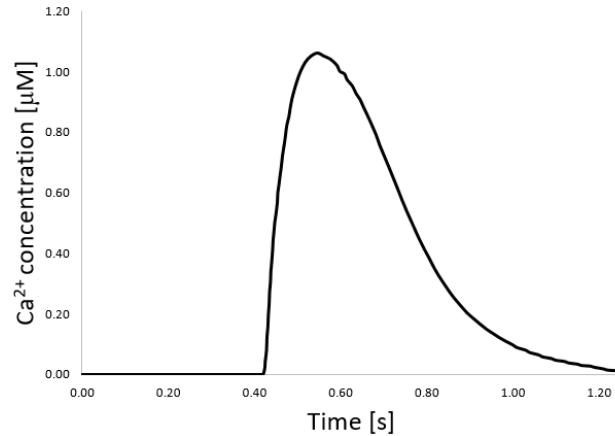


Displacement at the free node of the 3D model during muscle contraction

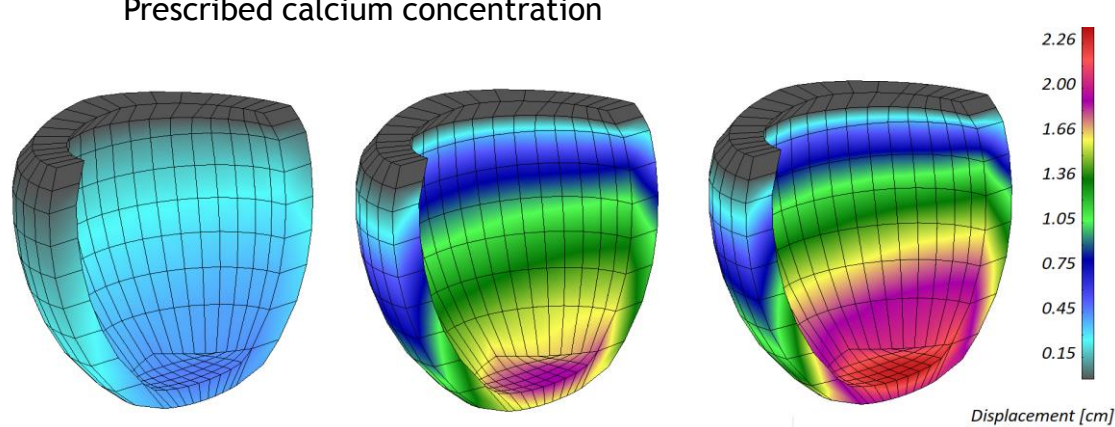
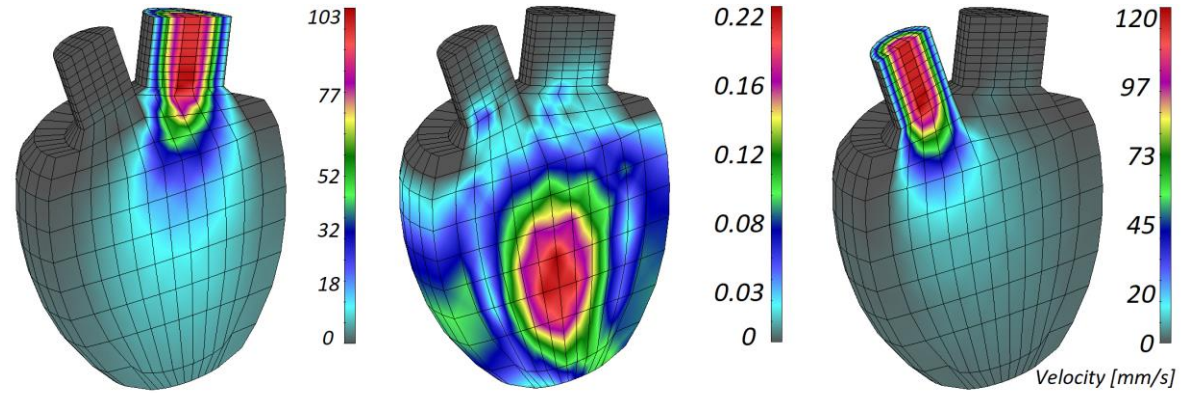


PAK linked with MP - Use cases

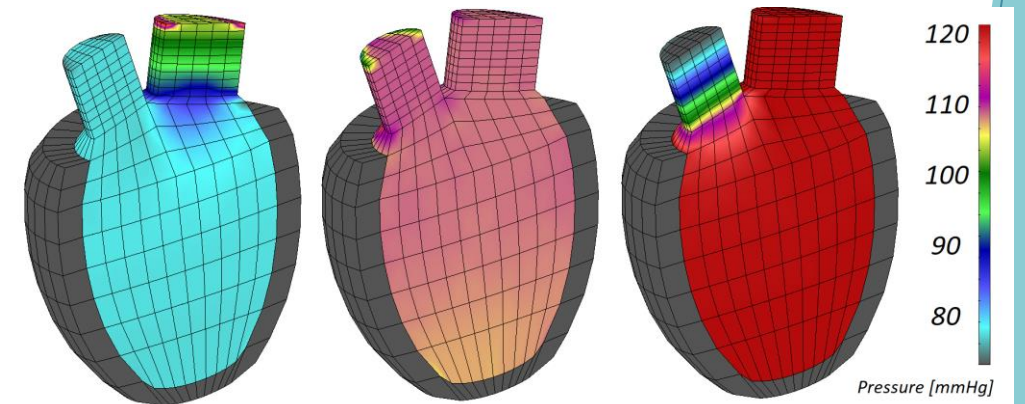
▶ LV parametric model



Prescribed calcium concentration

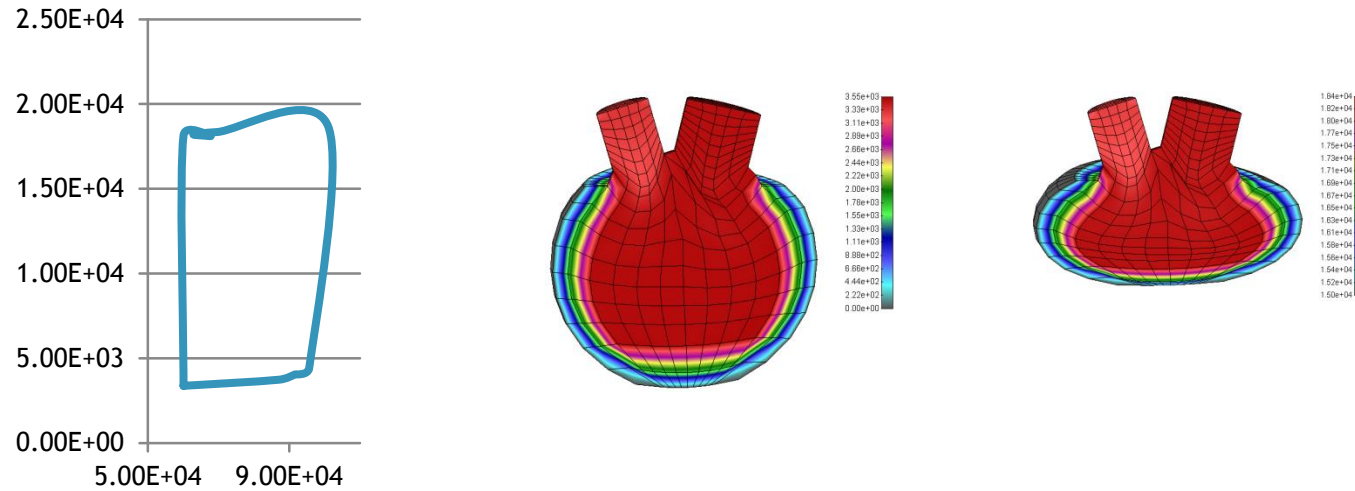


Solid displacements at start of diastole, end of diastole, and middle of systole

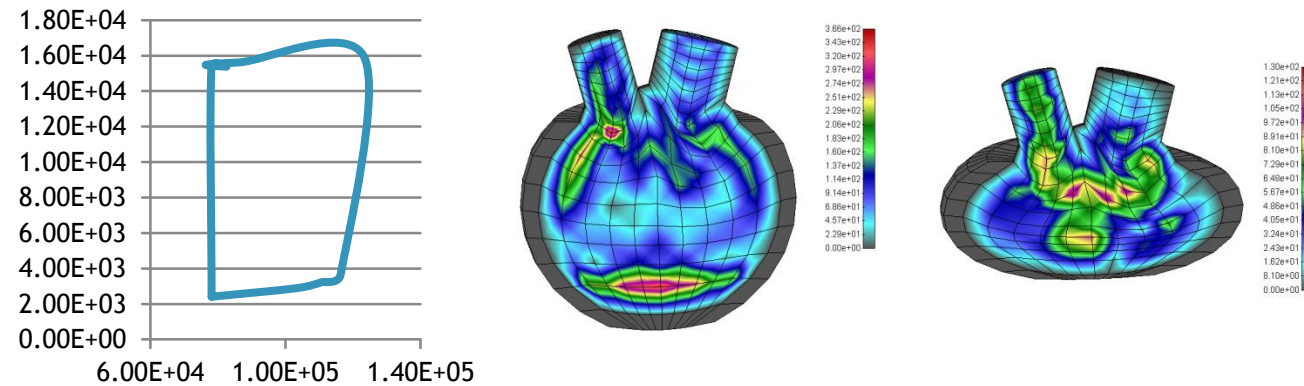


Pressures at start of diastole, end of diastole and middle of systole

Numerical results from SILICOFCM platform for patients before and after Entresto treatment

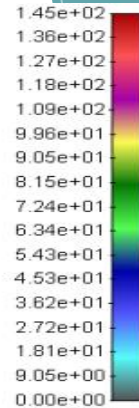
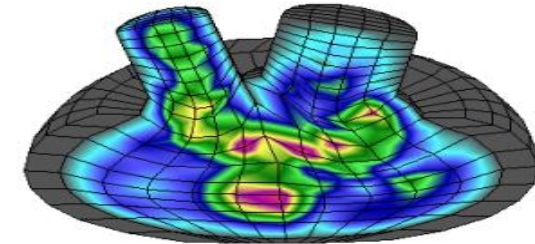
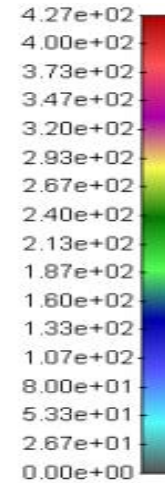
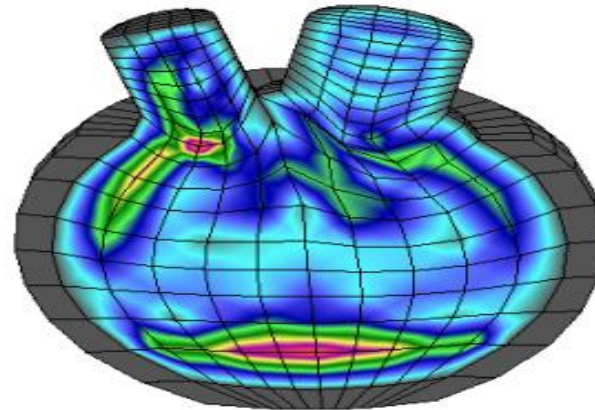
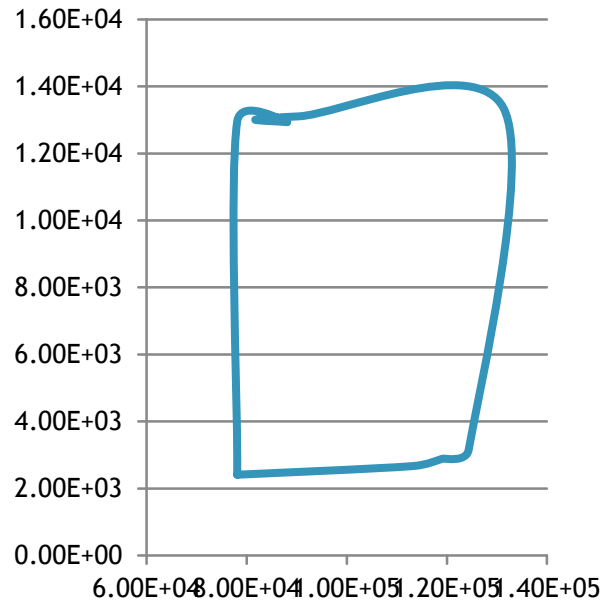


PV diagram, pressure diastolic distribution, pressure systolic distribution for case before Entresto treatment



PV diagram, velocity distribution in the diastolic phase, velocity distribution in the systolic phase for case after Entresto treatment

Numerical results from SILICOFCM platform for patients after DIGOXIN treatment



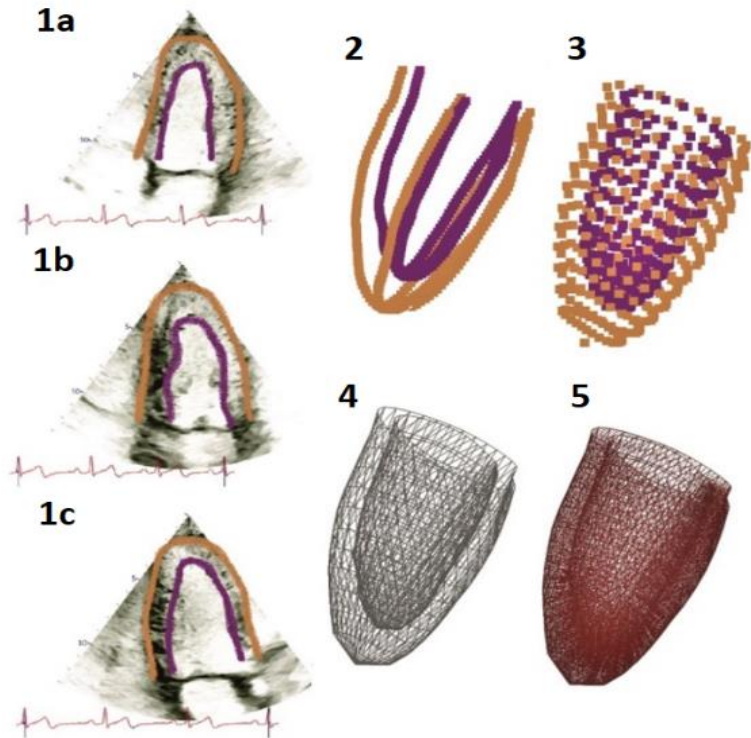
PV diagram, velocity distribution in the diastolic phase, velocity distribution in the systolic phase for case after Digoxin treatment

It was found that mean left ventricular ejection fraction increased from 74 ± 2 to 79 ± 1 percentage for 10 patients. In the simulation results ejection fraction was increased from 75 to 80 percentages which is correlated with the observed clinical measurements. Also, we found that velocity field gives increased values after digoxin treatment which may results as consequence of increased ejection fraction.

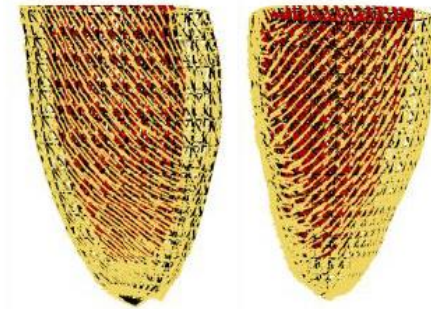
Upgrade FE biomechanical simulation (PAK Solver)

Solid and fluid left ventricle model generated from echocardiography

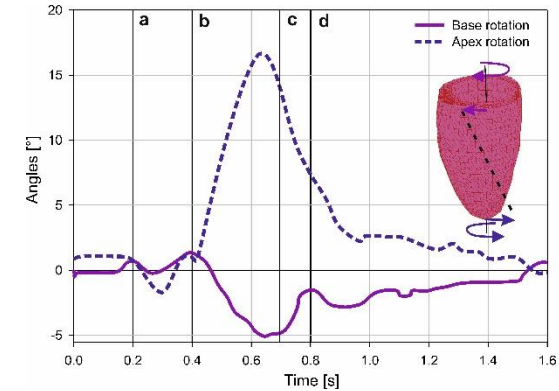
► Solid echo model



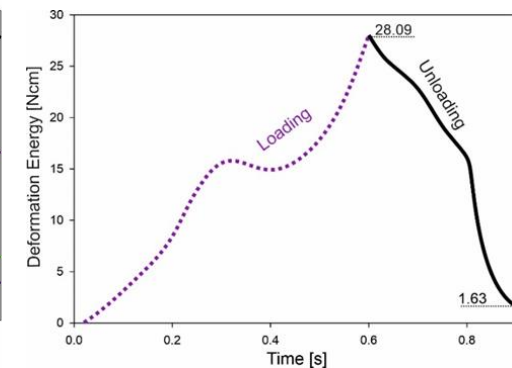
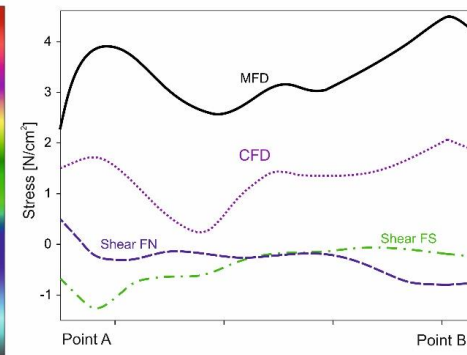
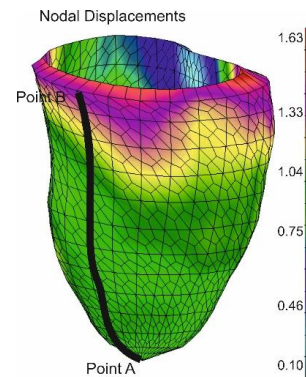
Model generation algorithm



Fibers



Prescribed rotation angles

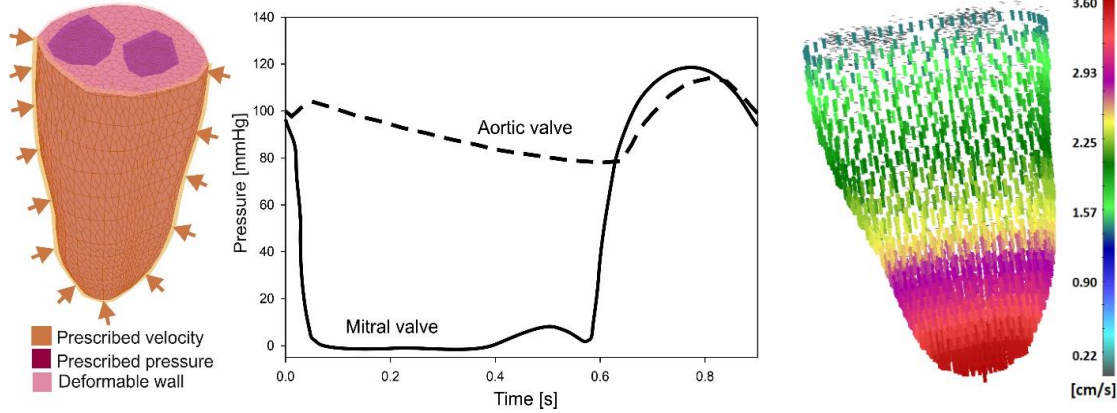


Solid displacements, stresses and deformation energy

Upgrade FE biomechanical simulation (PAK Solver)

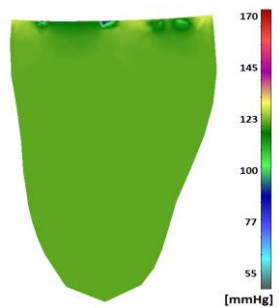
Solid and fluid left ventricle model generated from echocardiography

► Fluid echo model

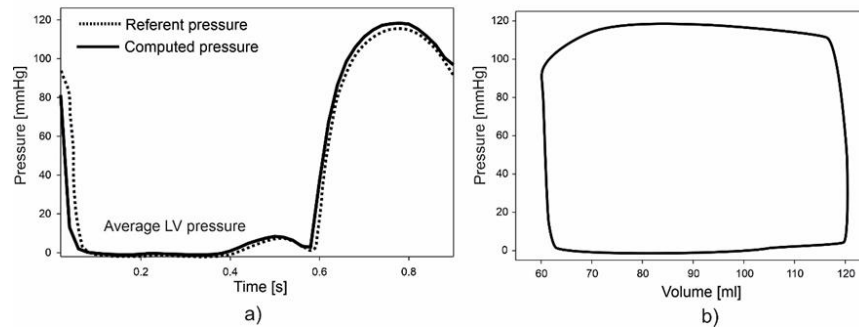


Fluid boundary conditions

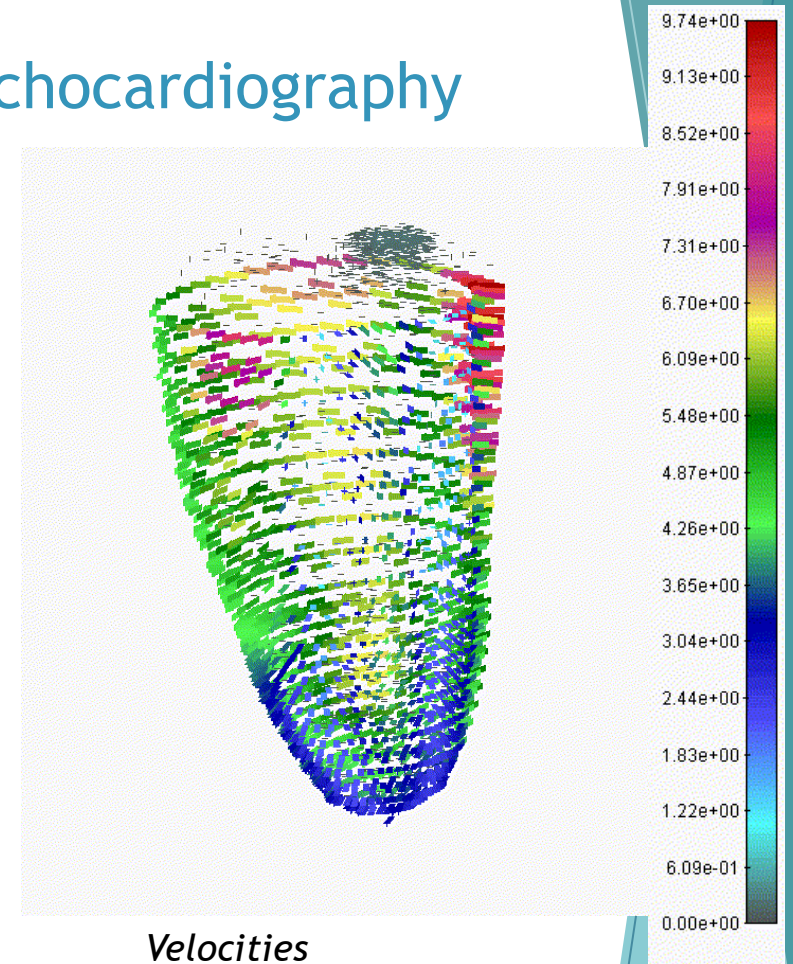
Velocities at the middle of systole



Pressures at the middle of systole

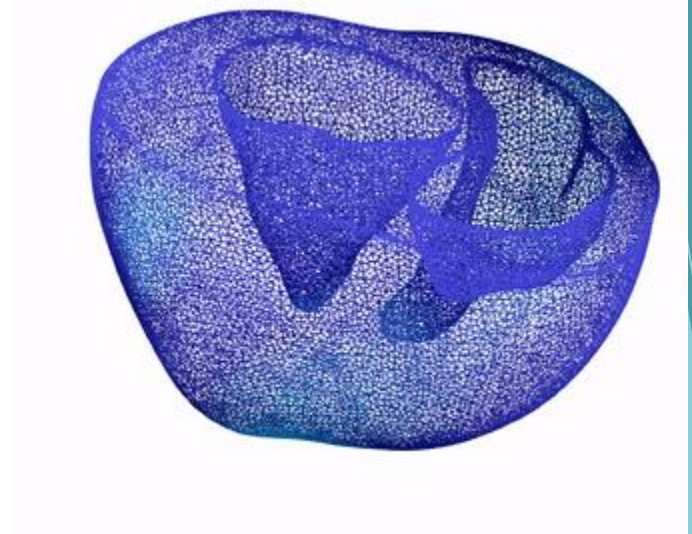
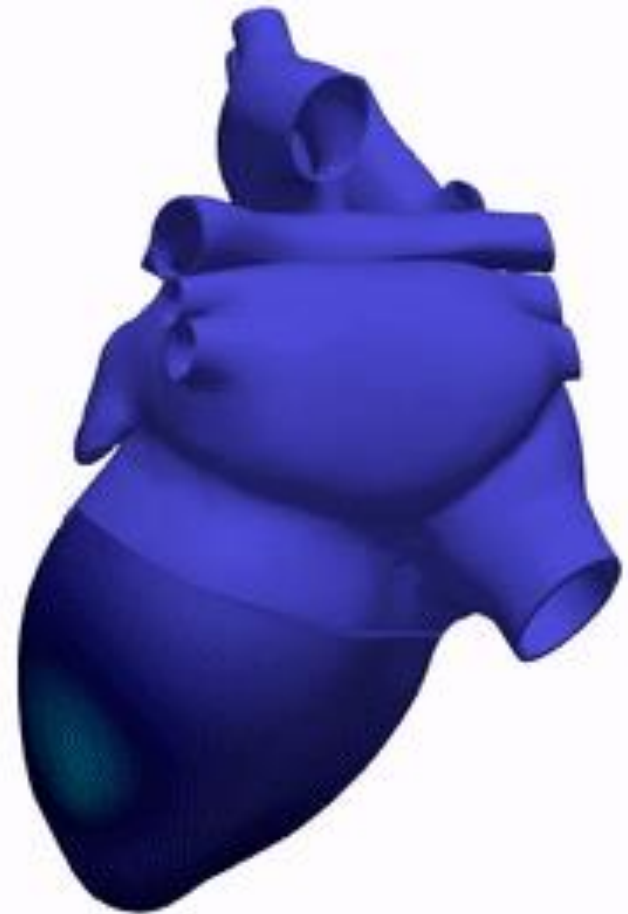
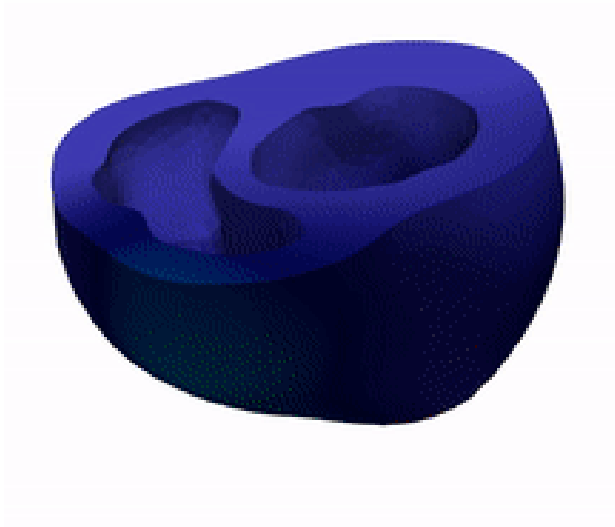


Pressure and p-V diagram



Velocities

Animations of total heart deformation



Conclusions

- ▶ The full human heart simulations using the Multiscale model and Decision Support System can provide physiologically relevant assessment of the familial cardiomyopathies simulated and the effect of drugs.
- ▶ These results can provide insights into clinically relevant observations of the disease and provide better insights on detailed drug effects.
- ▶ Future research challenges :
 - ▶ A pre-stress algorithm will be added to the simulations in order to achieve higher ejection fractions
 - ▶ The application of these methodologies to patient-specific anatomies for high throughput assessment for clinical purposes

