

>> digital twins for personalized medicine|



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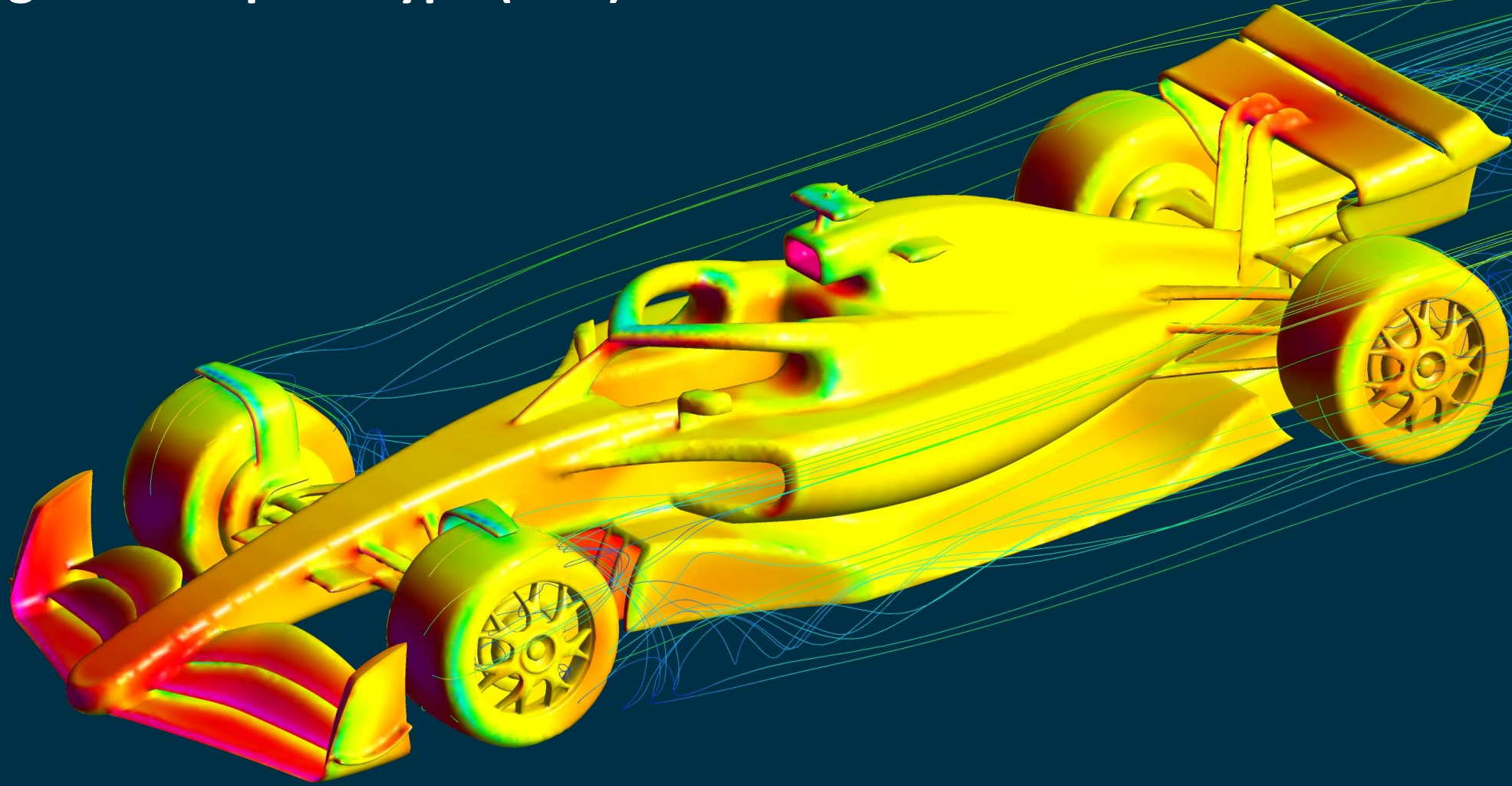


# Birth of Digital Twin concept: US Apollo 13 mission in 1970

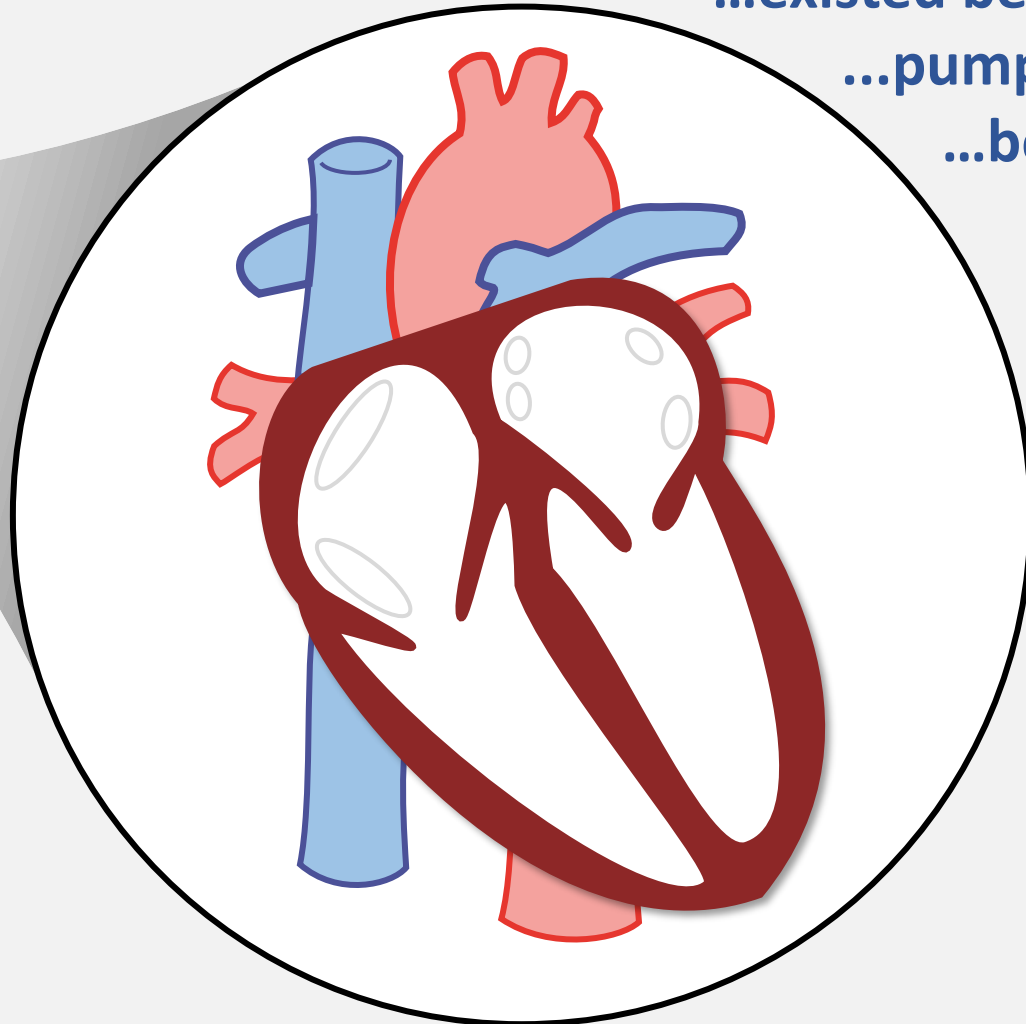
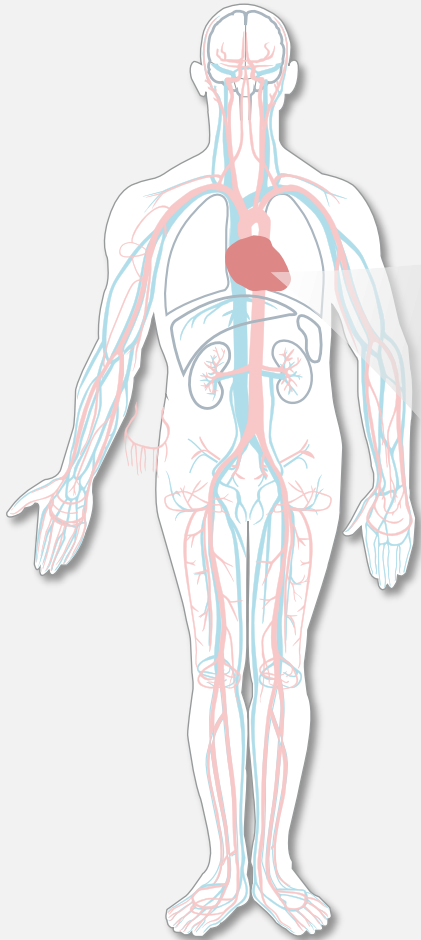




# Digital twin prototype (DTP)



# The heart ...

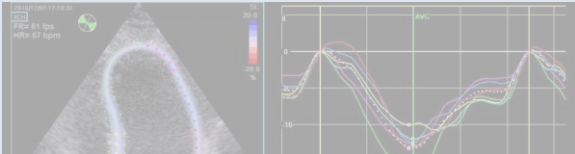


...existed before its digital models/twins  
...pumps ~7,500 liters of blood a day  
...beats ~100,000 times a day

# Biophysical modeling in a nutshell ...



## OBSERVATIONS



EFFECTS ( $y$ )

CAUSES ( $x$ )

SYSTEM PROPERTIES

*Vascular Resistance*

**Cardiovascular physiology is complex, dynamic and non-linear**

$$y = f(x, t)$$

Ohm, Laplace, Bernoulli, Fick, ...

(Pressures)

...

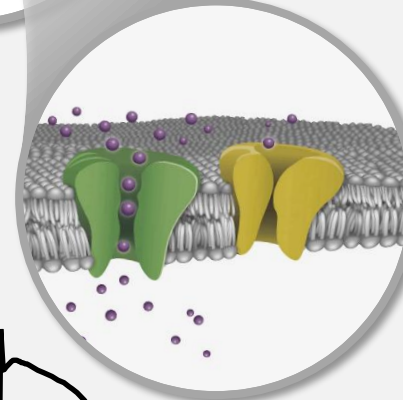
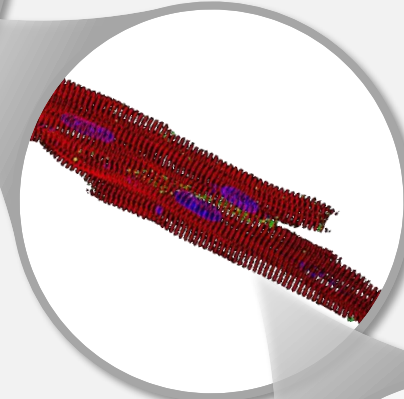
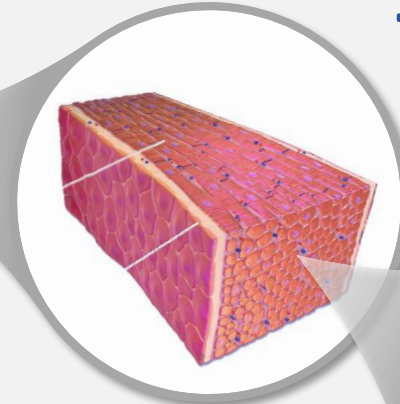
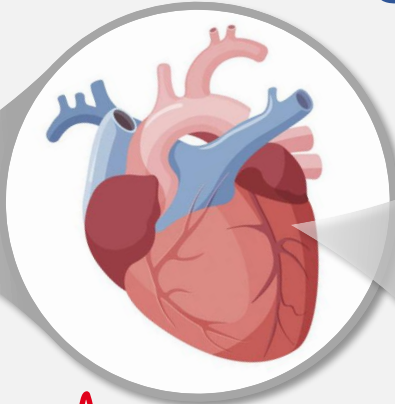
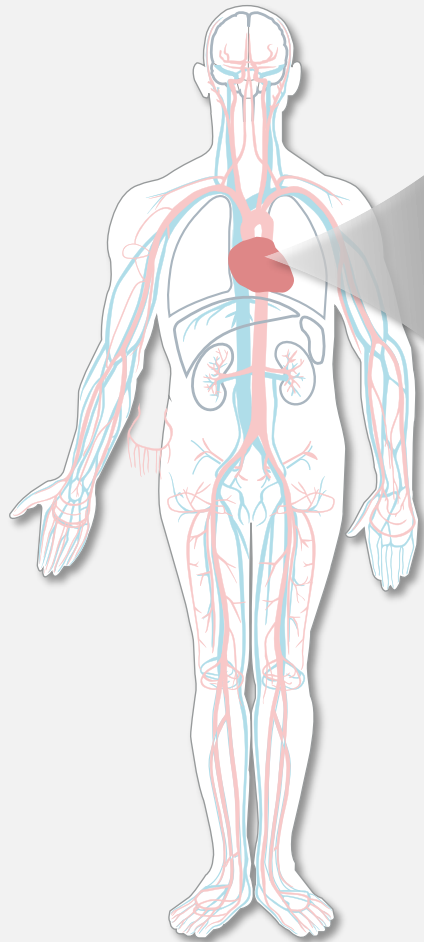
system

organ

tissue

cell

protein  
(ion channel, actin,  
myosin, titin, etc.)



blood flow

pressure

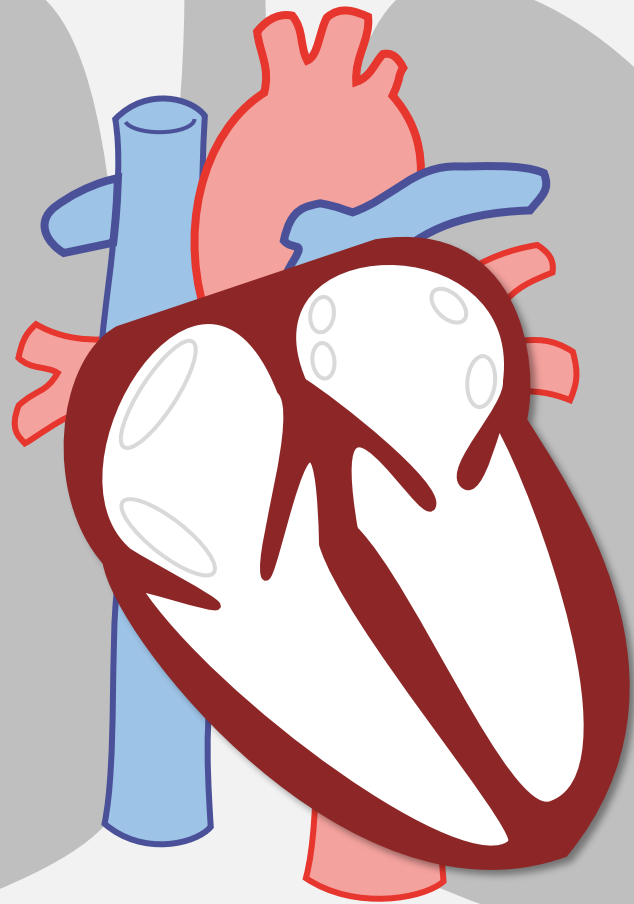
force

[Ca<sup>2+</sup>]

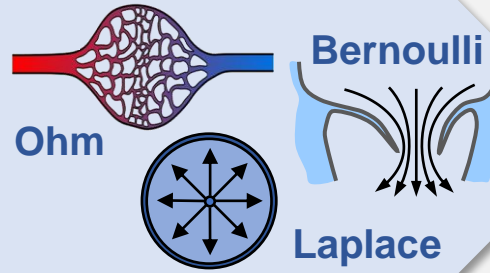
membrane potential



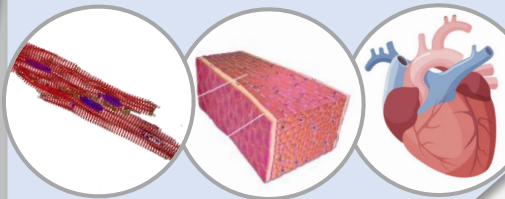




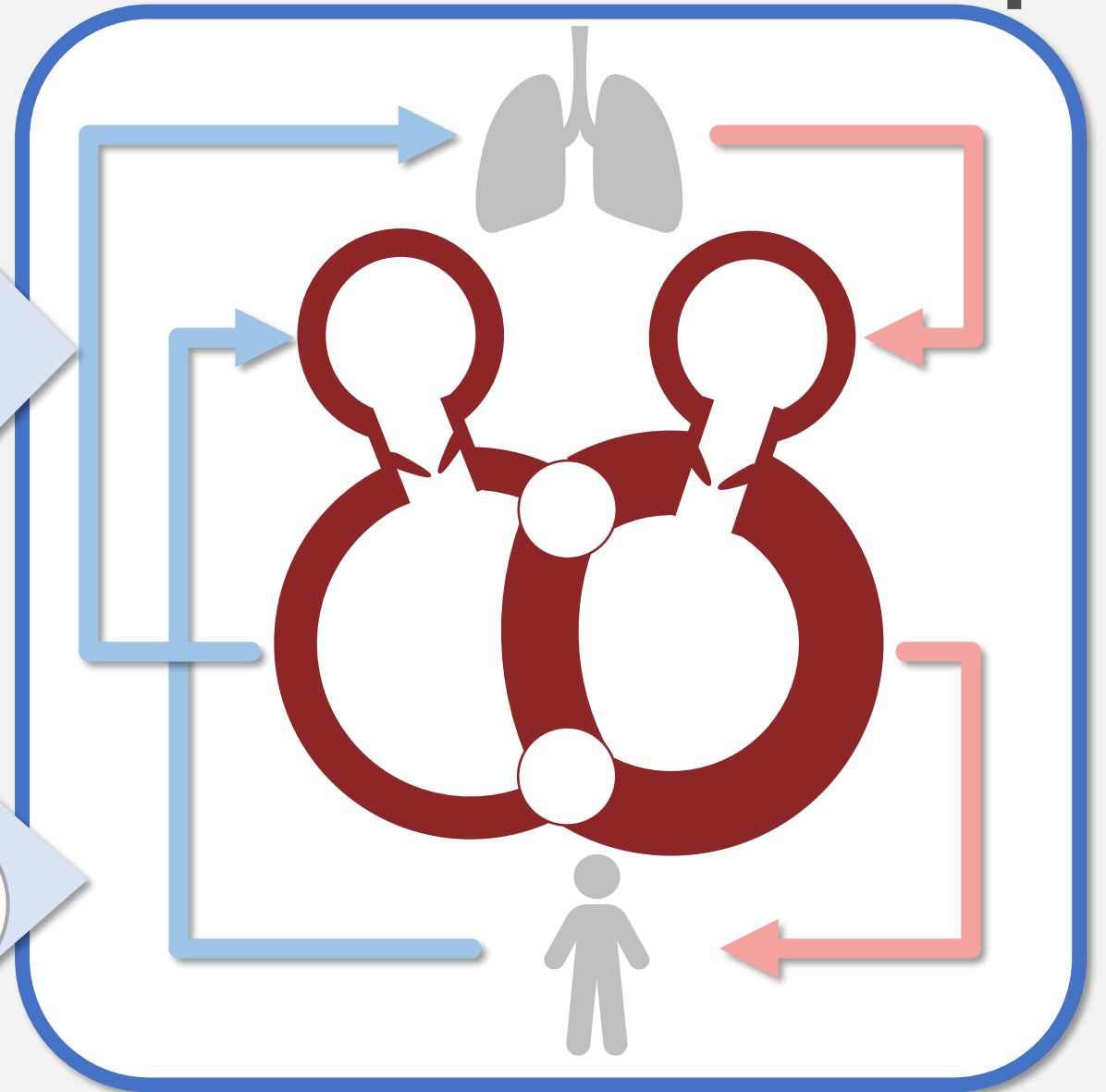
**Physics**

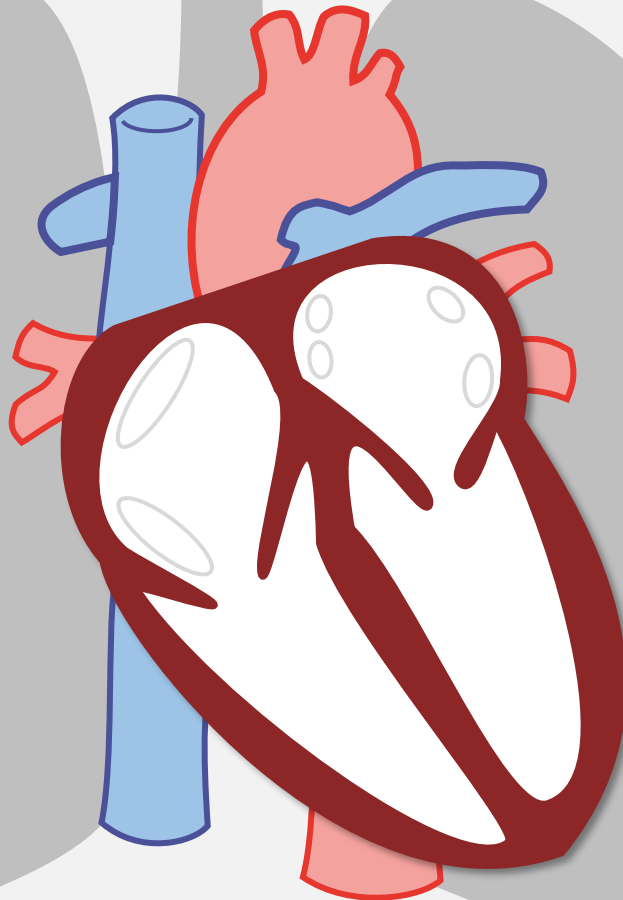


**cell    tissue    organ**

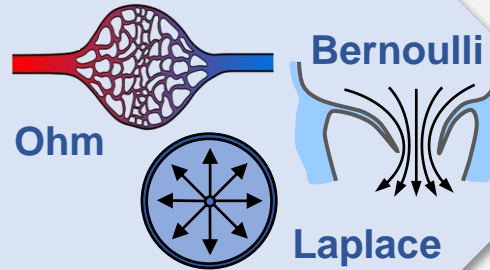


**Physiology**

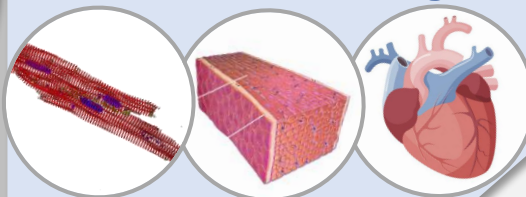




## Physics



cell    tissue    organ



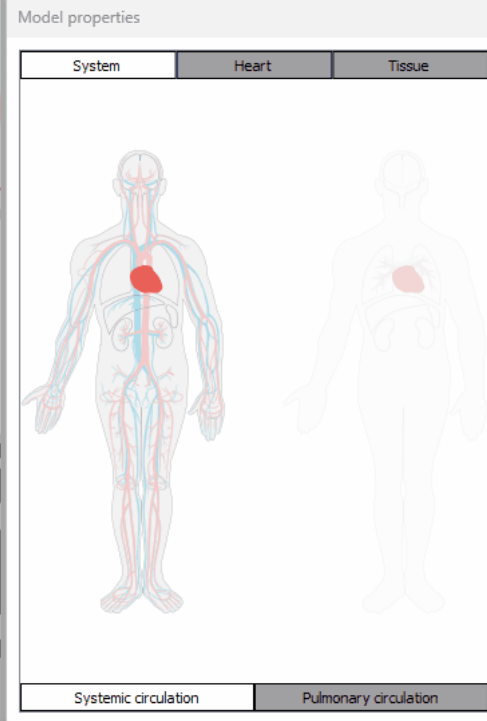
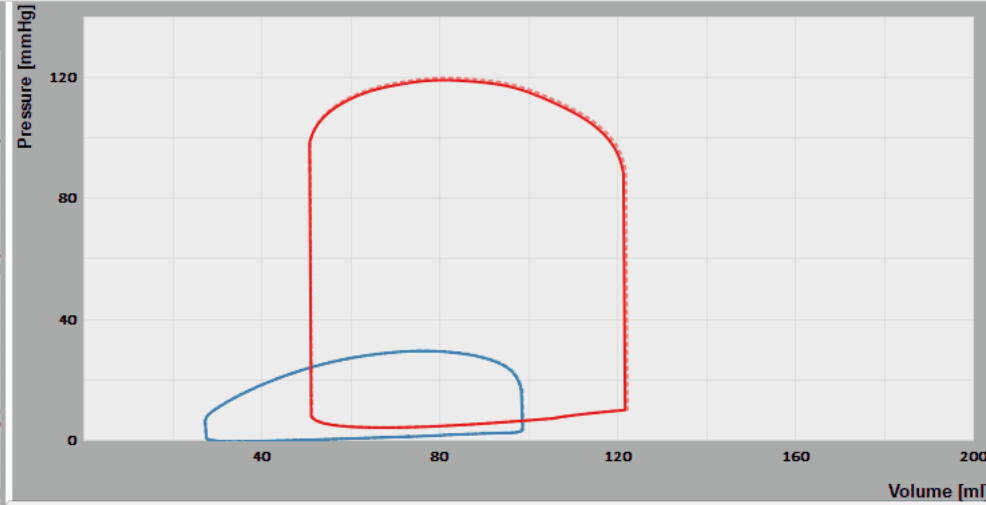
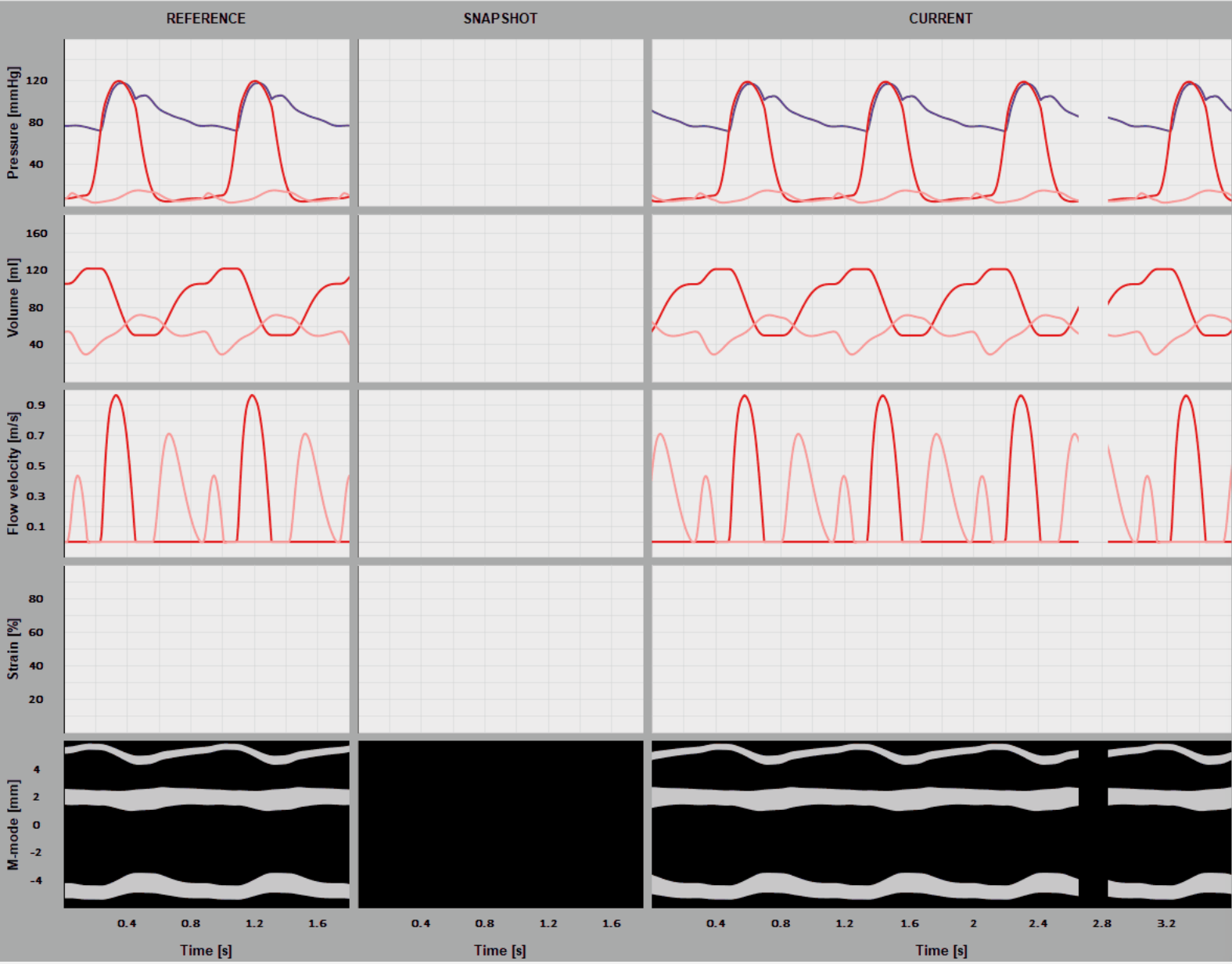
## Physiology

```

199 // Calculate Active stress based on C
200 LNormSe = (Ls - Lsi) / LenSeriesElement;
201 double SfIso = (C * L) * (1.51*SfAct);
202 double SfRest = 0;
203 if (CRest !=0)
204     SfRest = L * (1.51 * CRest * SfAct);
205
206 // Passive Stress
207 double kk3 = 2 * LsRef / dLsPas;
208 double LfP = Ls / Ls0Pas;
209 double y = exp(log(LfP) * k1);
210 double yTit = exp(log(LfP) * kk3);
211 SfEcm = (y - 1)*(0.0349*SfPas);
212 SfPasT = SfEcm+(yTit - 1)*(0.01*SfAct);
213 double DSfPasDef = y * (0.0349*SfPas*k1) + yTit * (0.01*SfAct*kk3);
214
215 // Calculate total stress
216 Sf = SfPasT +(SfIso + SfRest)*LNormSe - SfRest;

```

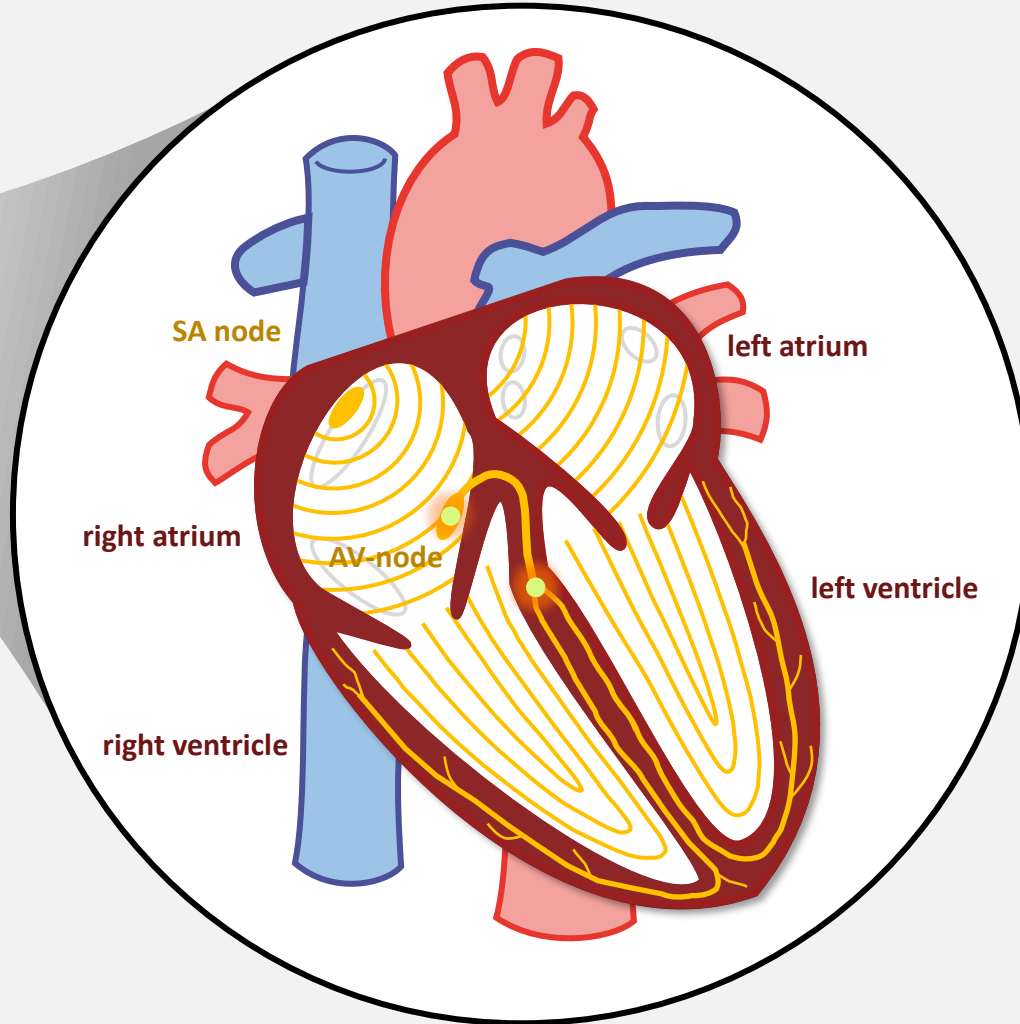
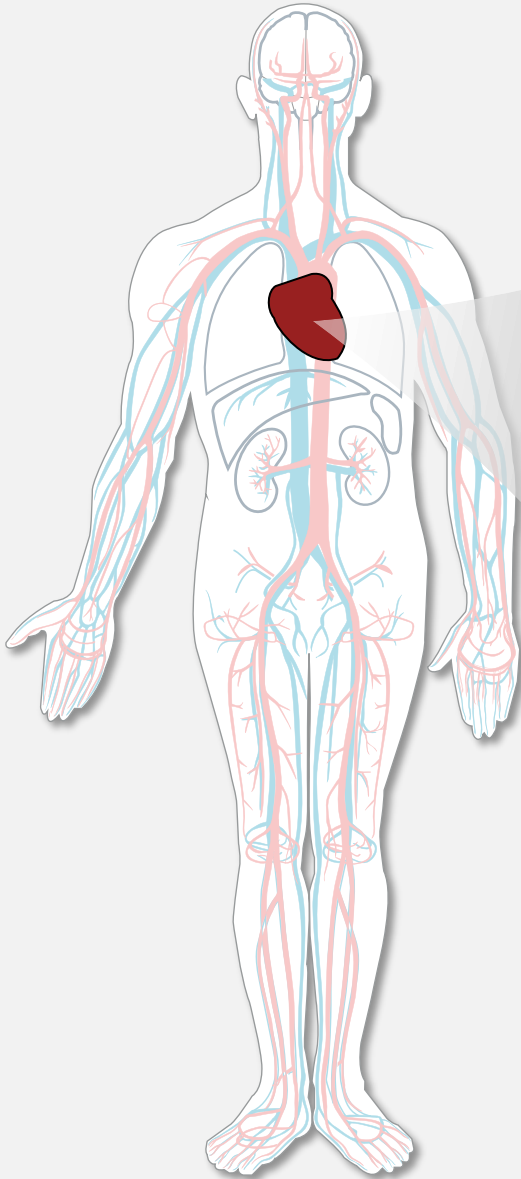




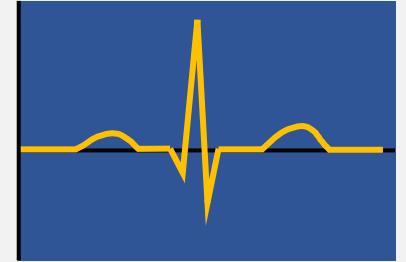
Property	Value
Homeostatic Control	
Heart rate	70.0
AV delay	126.0
AV delay offset	-40.0
Mean arterial pressure	90.0
Venous return	5.0
Homeostatic pressur...	<input type="checkbox"/> False

Property	Value
Systemic Circulation	
Arterial stiffness coeffic...	100.0
Venous stiffness coeffic...	100.0

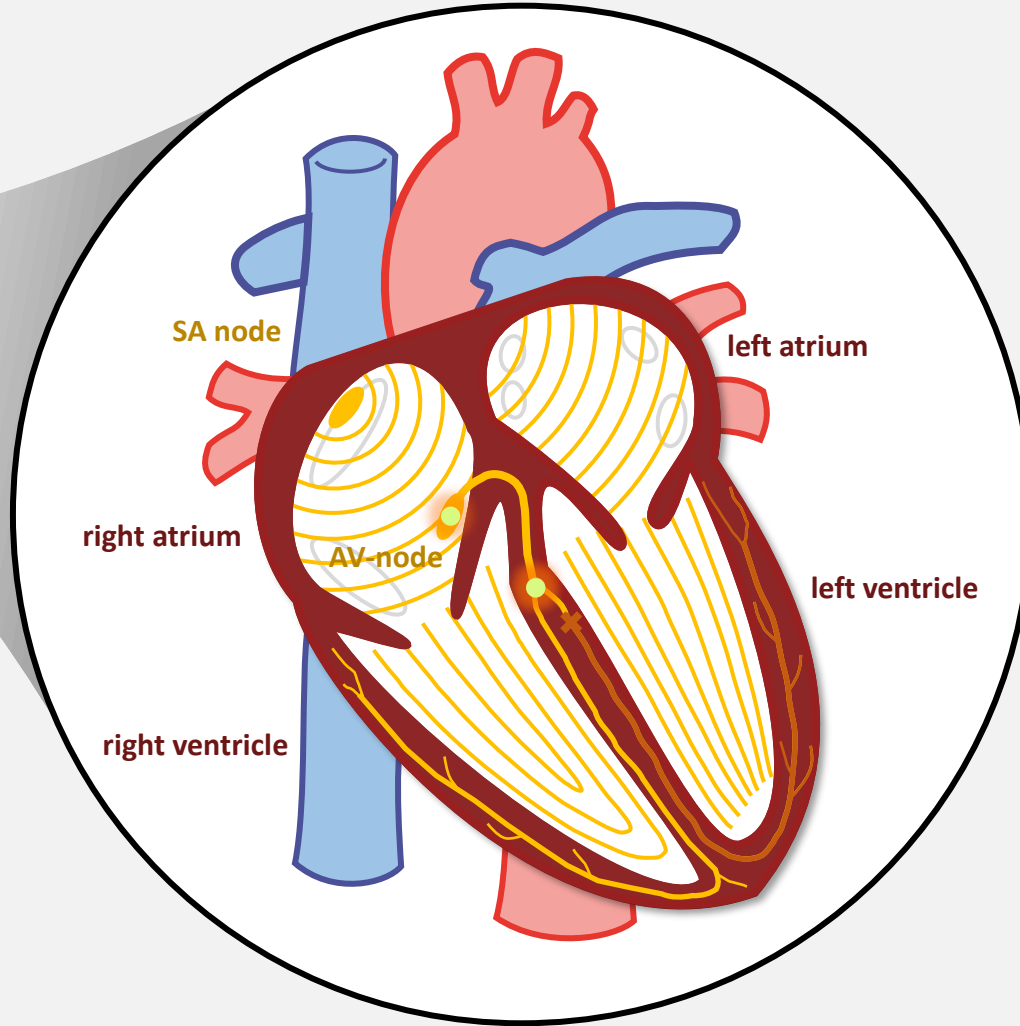
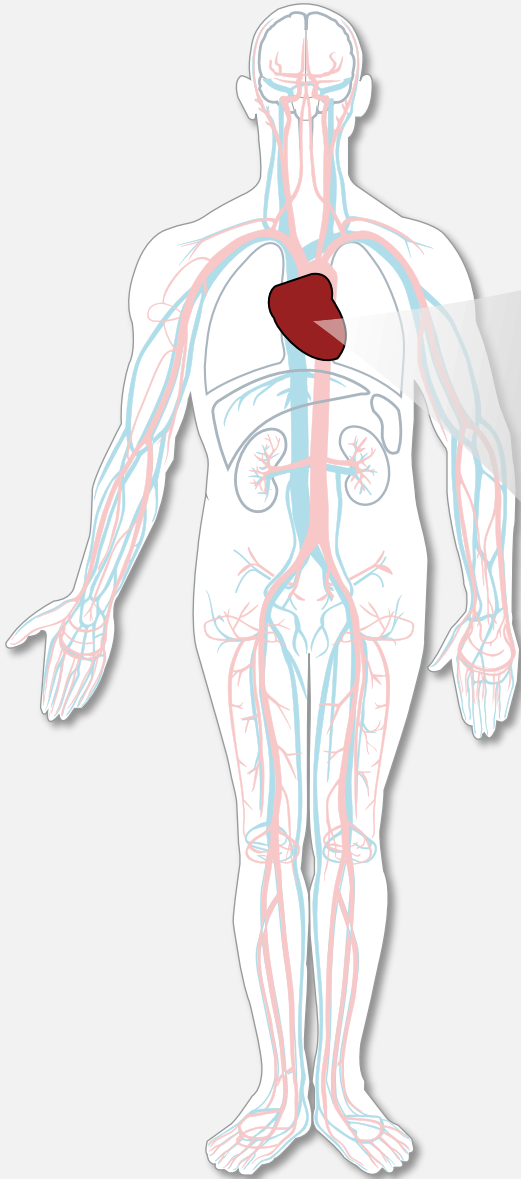
# electrical activation of the **normal** heart



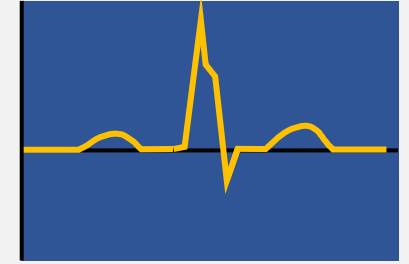
ECG



# electrical activation disturbed in the **failing** heart



ECG

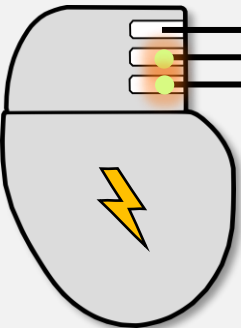
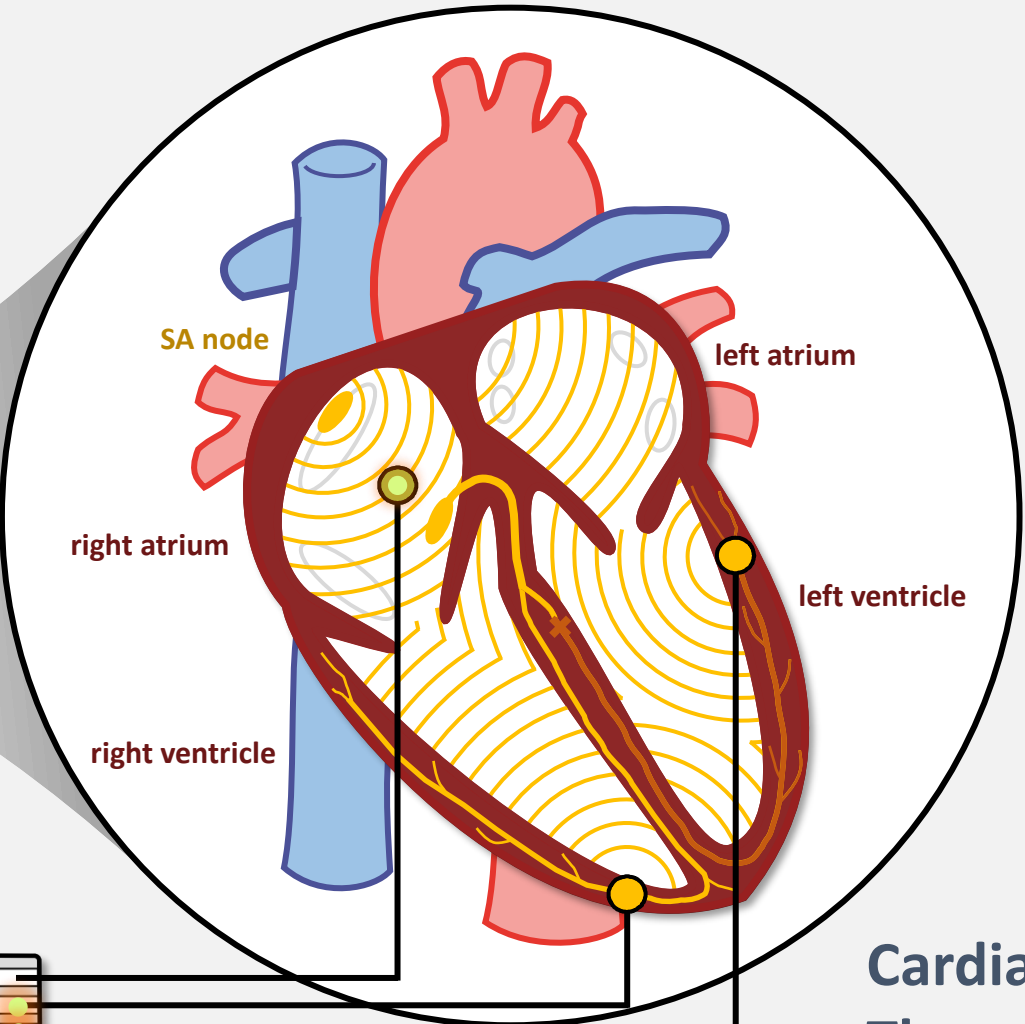


**Left Bundle-Branch Block (LBBB)**





# heart failure



pacemaker

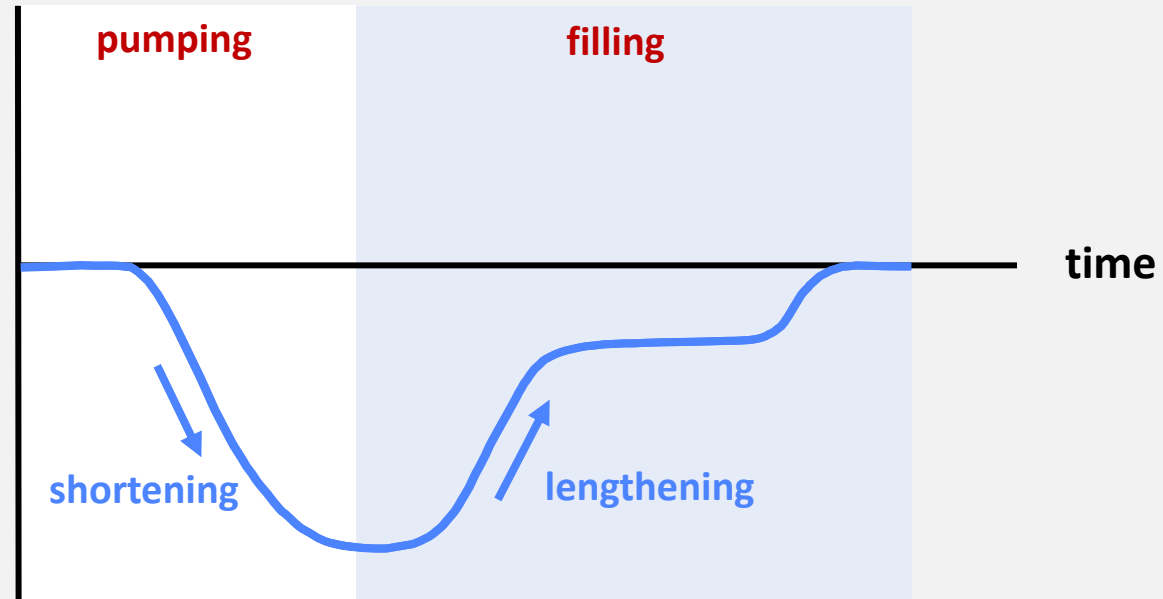
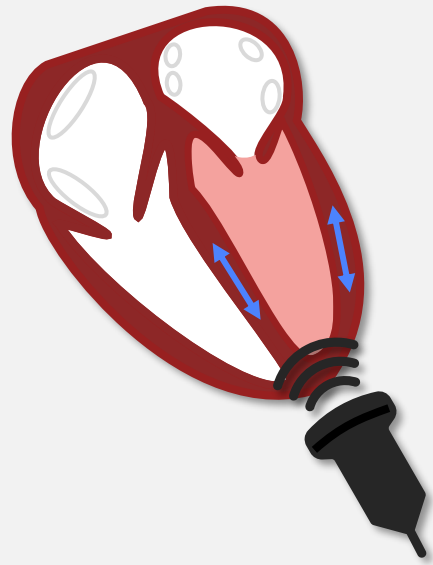
Cardiac Resynchronization Therapy (CRT)

**CRT success rate: 50-70% of the patients benefits**  
**...one in three patient does not benefit from CRT**

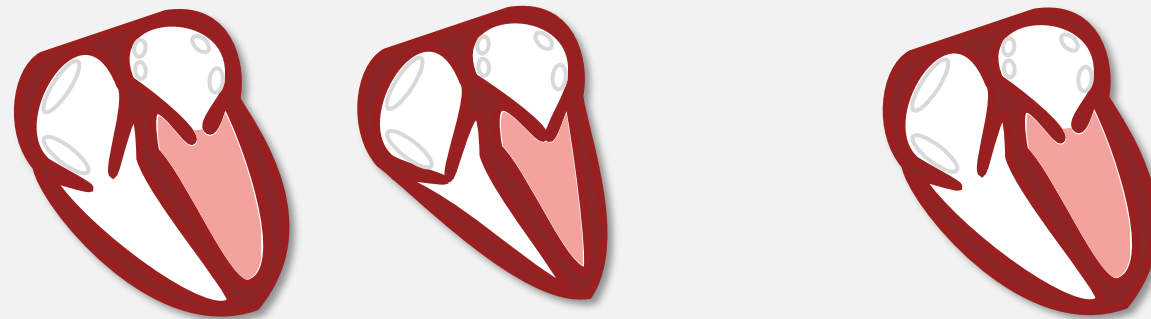
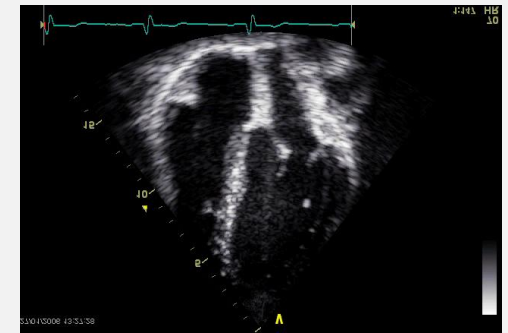
1 cardiac cycle



Deformation of the left ventricular wall



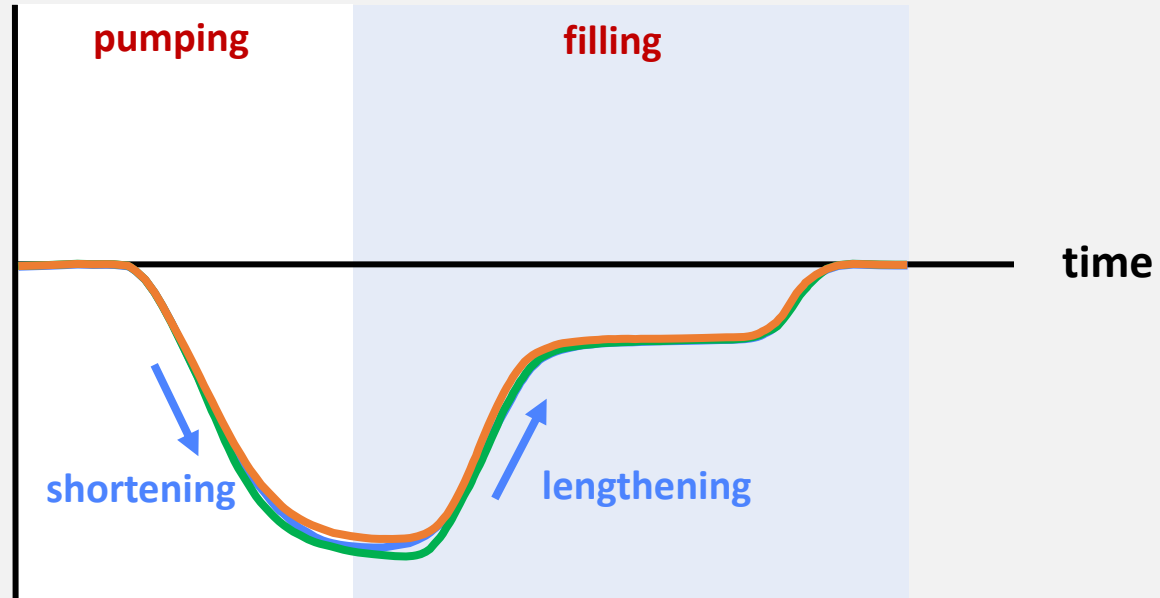
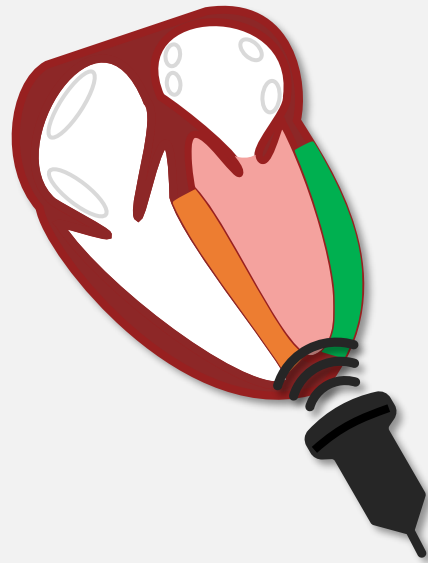
echocardiography



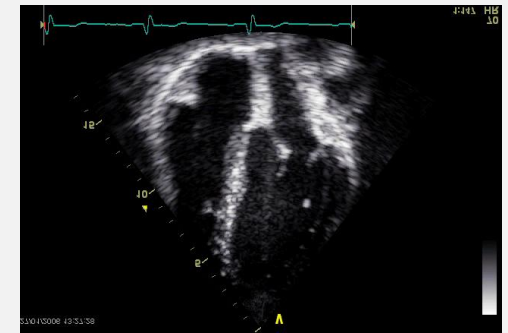
1 cardiac cycle



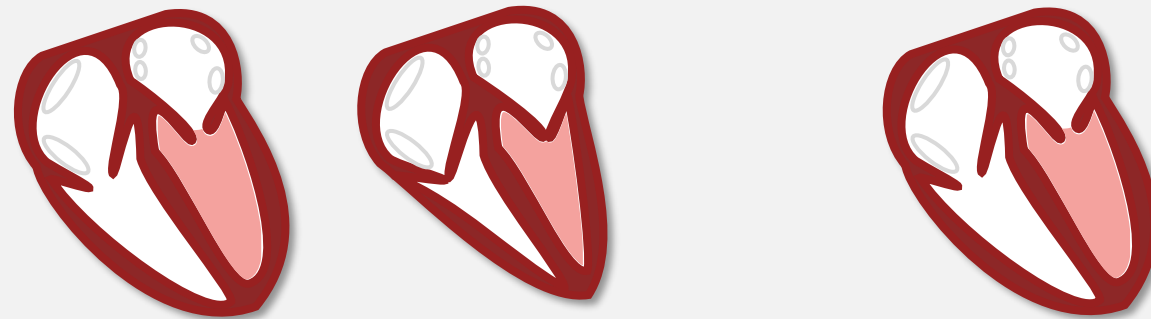
Deformation of the septum and free wall



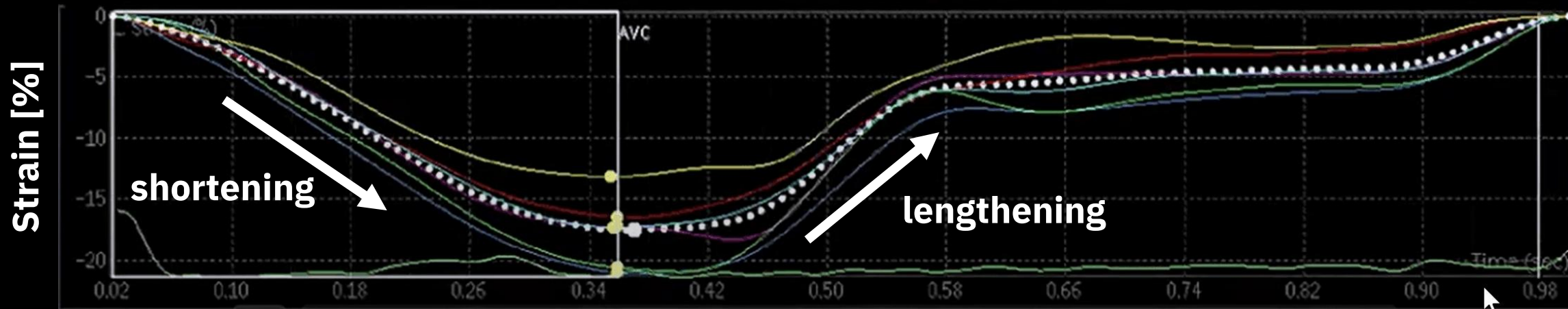
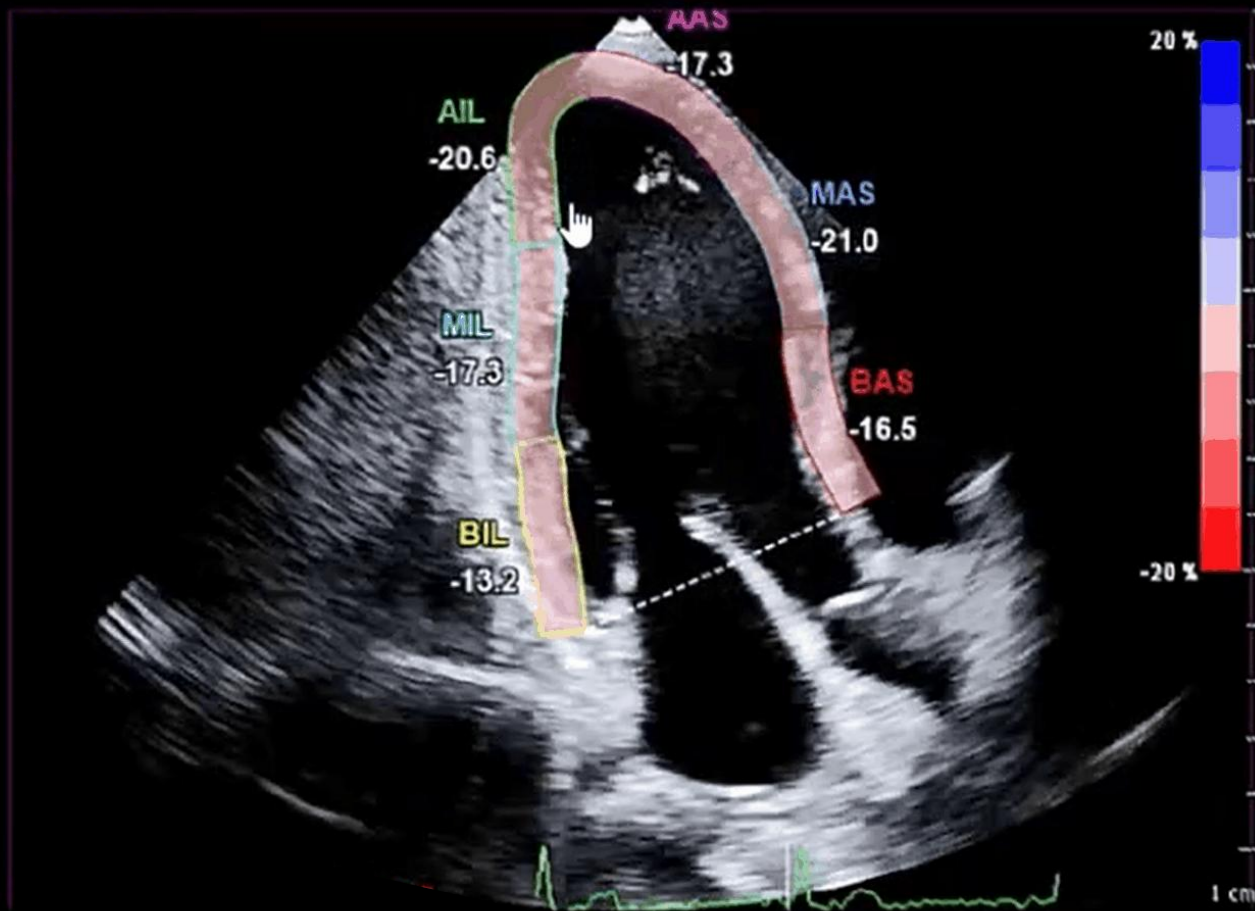
echocardiography



Global pump function of the left ventricle is the result of regional deformation patterns





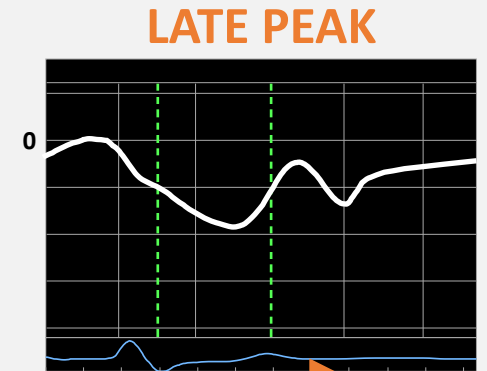
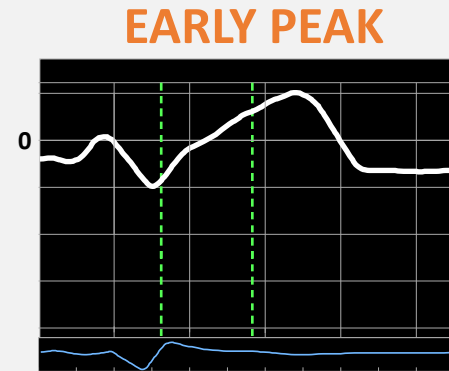
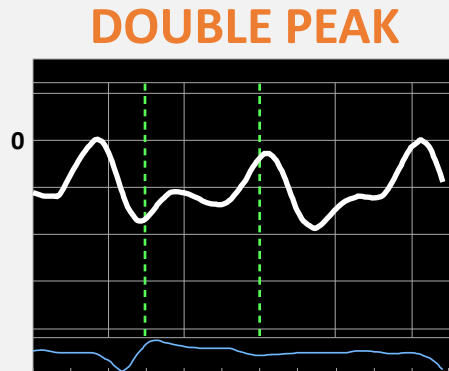
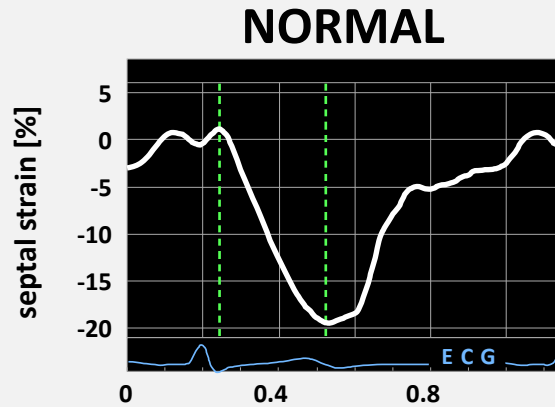


# Septal deformation patterns reveal underlying disease substrates



132 heart failure patients with LBBB

PATIENTS

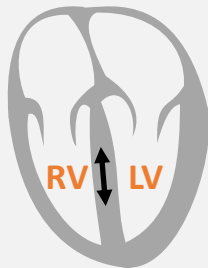


decreasing response to CRT

COMPUTER SIMULATIONS

CRT Response:  $\Delta$ LV EF (%)

$\Delta$ LV ESV (%)



synchronous activation

Leenders GE, Lumens J, et al. *Circ Heart Fail* 2012;5:87-96

Lumens J, Leenders GE, et al. *Circ Cardiovasc Imaging* 2012;5:491-499

# Conclusion I



## FORWARD

Biophysical models of the human heart and circulation can improve our understanding of (imaging-derived) phenotypic characteristics of the failing heart. Models can be used for hypothesis generation / evaluation.

Fancy stuff, but how can the individual patient benefit from this technology?



Nieuw onderzoek

# 'Digitale tweeling' uitkomst voor hartpatiënten: kan effect behandeling voorspellen

30 januari 2024 09:08 • Aangepast 30 januari 2024 11:18



Met een 'digitale tweeling' controleren of een pacemakerbehandeling goed werkt voordat die bij de patiënt wordt uitgevoerd: dat kan volgens nieuw onderzoek van Universiteit Maastricht en UMC Utrecht. Met een computermodel wordt dan gecheckt of dit de juiste behandeling voor een hartpatiënt is.



## Net binnen

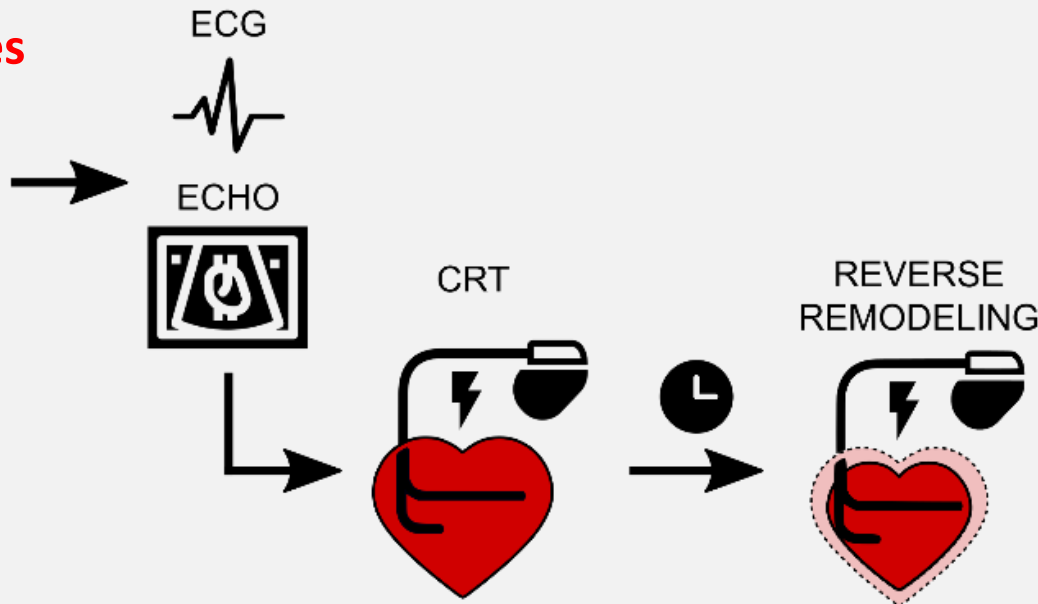
- 22:06 Toch geen Apple Car meer in de maak: ontwikkeling gestopt
- 22:01 Suzanne van MAFS mist spanning in huwelijk met Bastiaan: 'Ik wil kunnen stomen'
- 21:53 Duitse voetbalsters voelen dat zij móeten winnen van Oranje
- 21:27 Man van Lady Gabriella Windsor op 45-jarige leeftijd overleden
- 20:50 Nederlandse wapens naar Oekraïne: 'Het moet meer en het moet sneller'

[Meer nieuws](#)

# *In silico* trial: virtual cardiac resynchronization therapy (CRT) in Digital Twins of heart failure patients



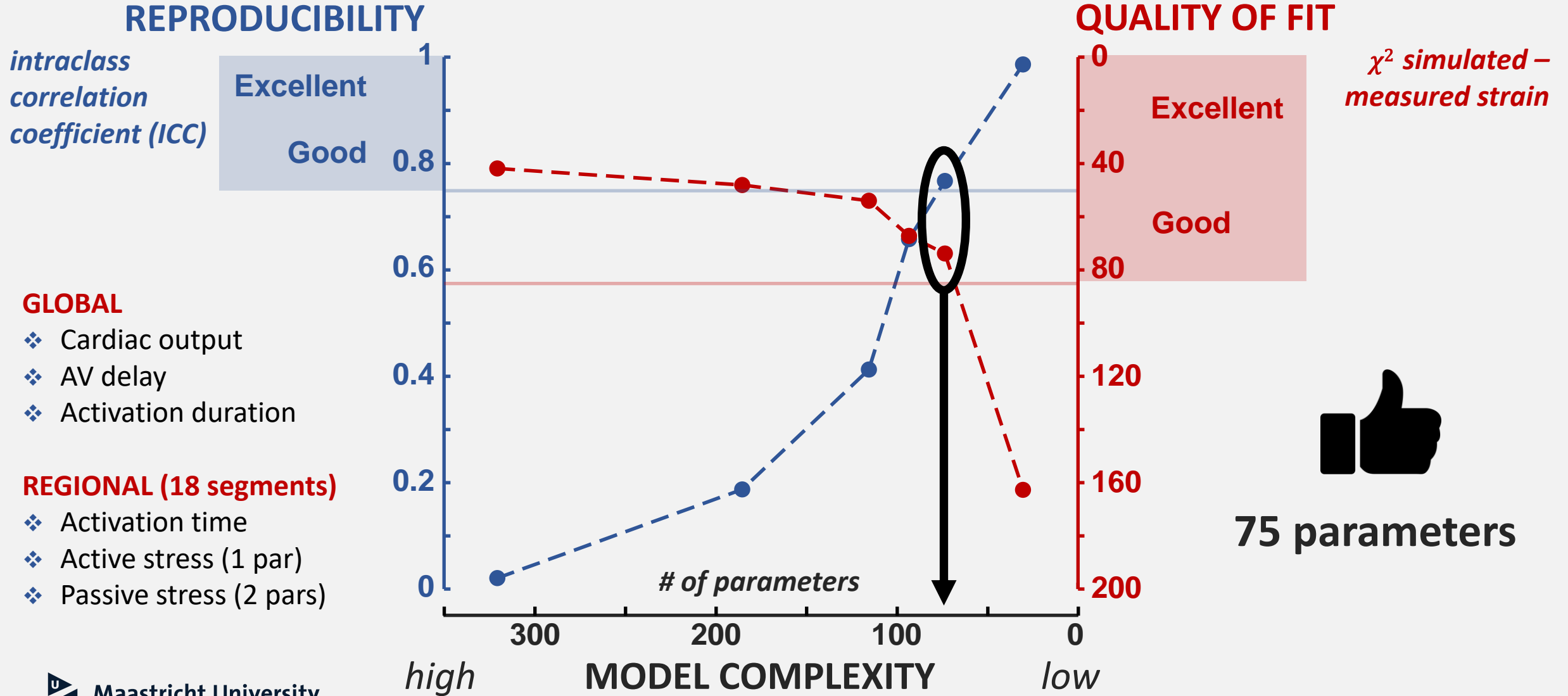
45 CRT candidates



**Table 1:** Baseline characteristics (n=45).

Age (years)	66 ± 10
Male gender (% , n)	62%, 28
QRS duration (ms)	171 ± 21
LBBB morphology <sup>a</sup> (% , n)	84%, 38
CRT Class I indication (% , n)	82%, 37
Atrial fibrillation (% , n)	11%, 5
Ischaemic heart disease (% , n)	33%, 15
LVEDV (mL)	217 ± 83
LVESV (mL)	172 ± 81
LVEF (%)	23 ± 9
ACE-inhibitor/AT2 (% , n)	93%, 42
Beta-blocker (% , n)	67%, 30
Diuretics (% , n)	96%, 43
Spironolactone/eplerenone (% , n)	51%, 23

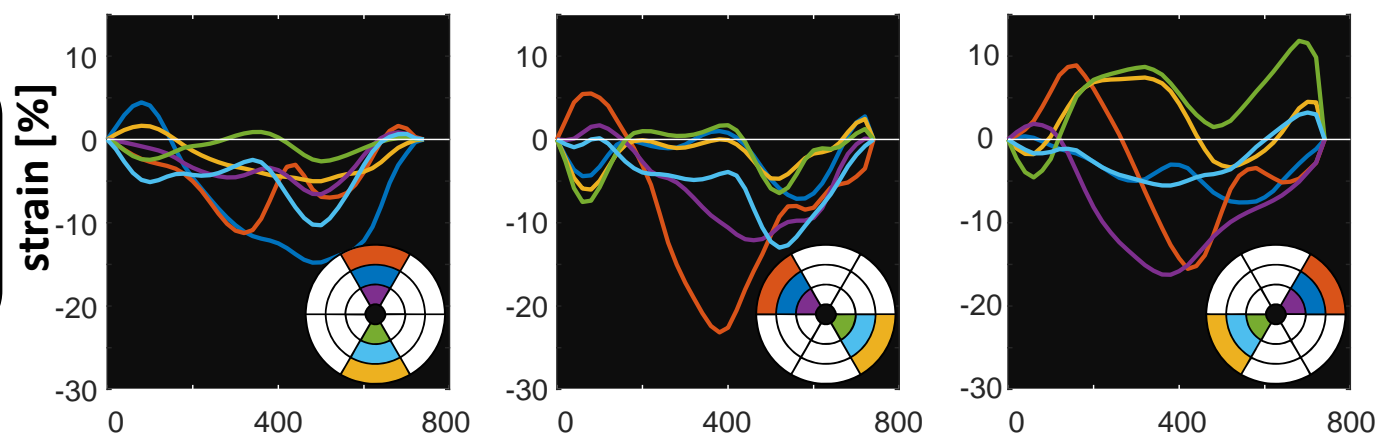
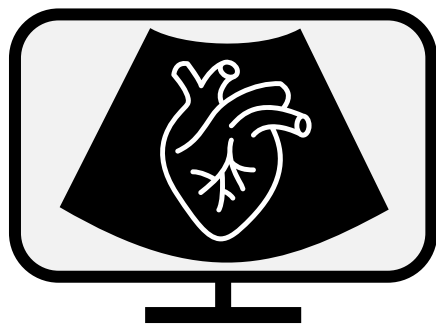
# Model complexity: reproducibility vs. quality of fit



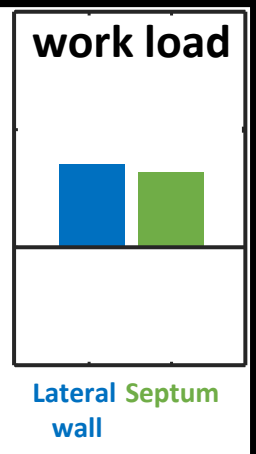
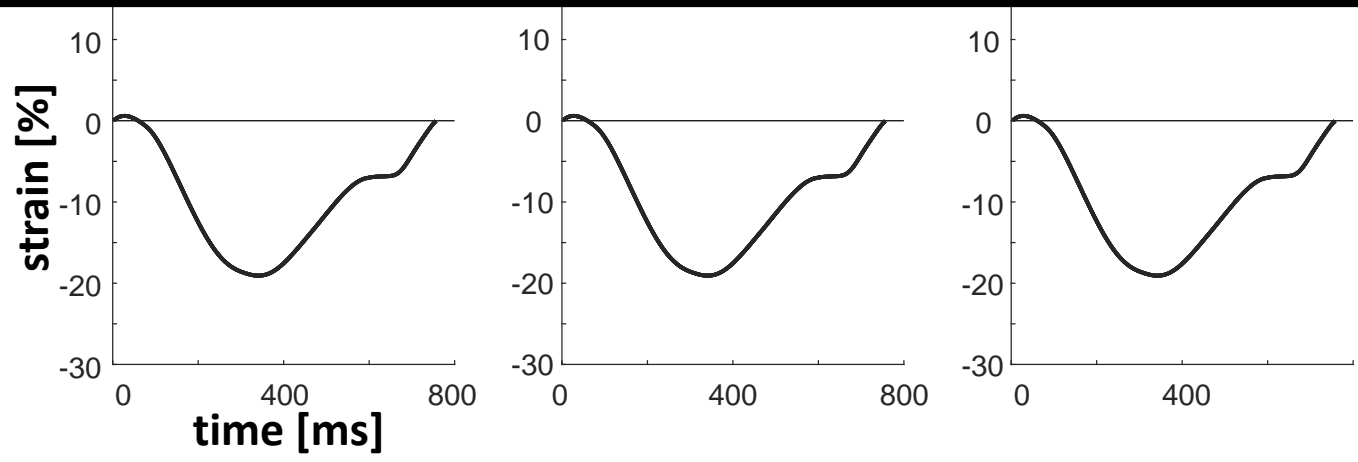




## REAL PATIENT

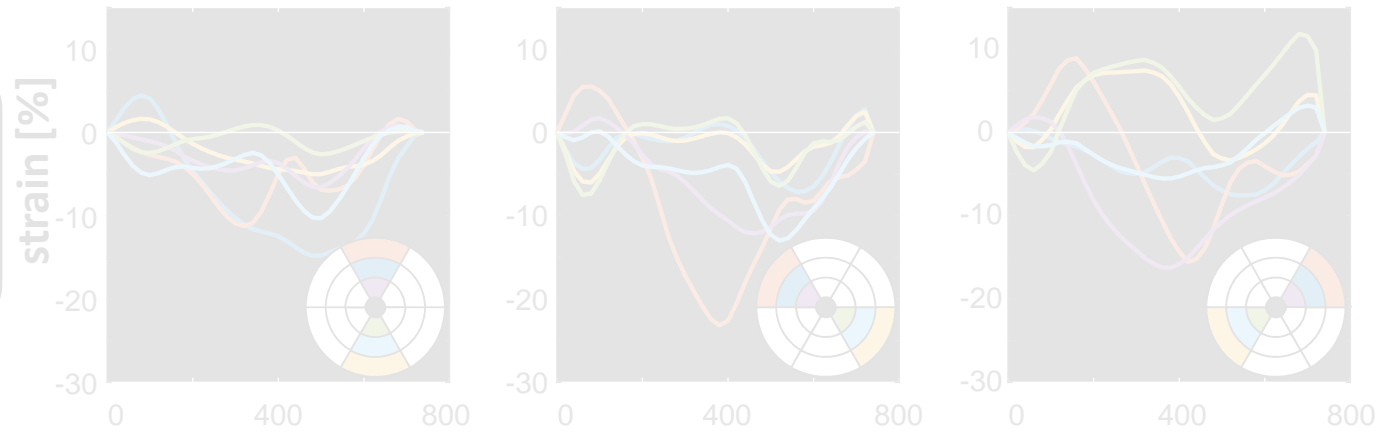
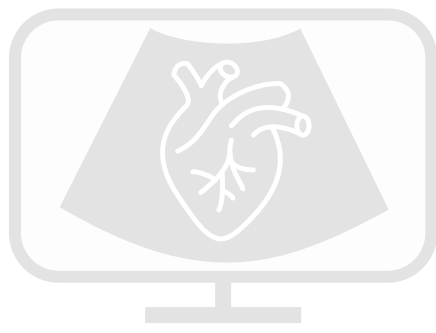


## DIGITAL TWIN

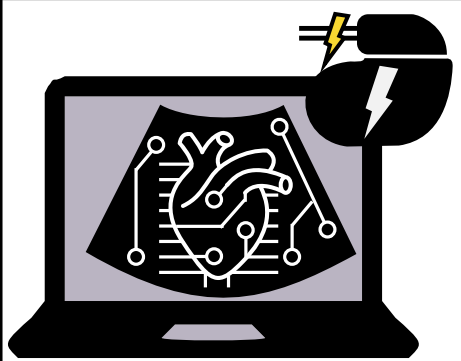




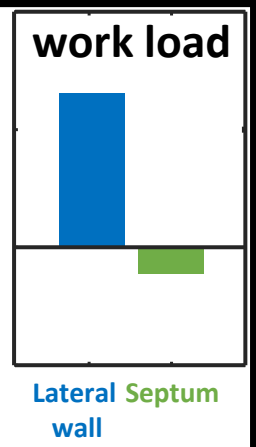
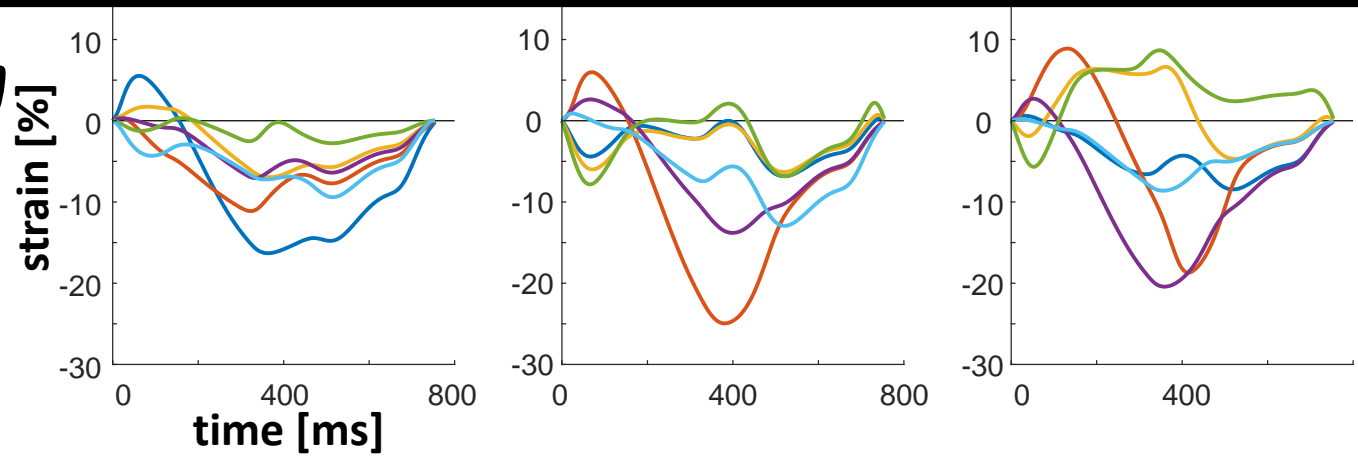
# REAL PATIENT



# virtual CRT

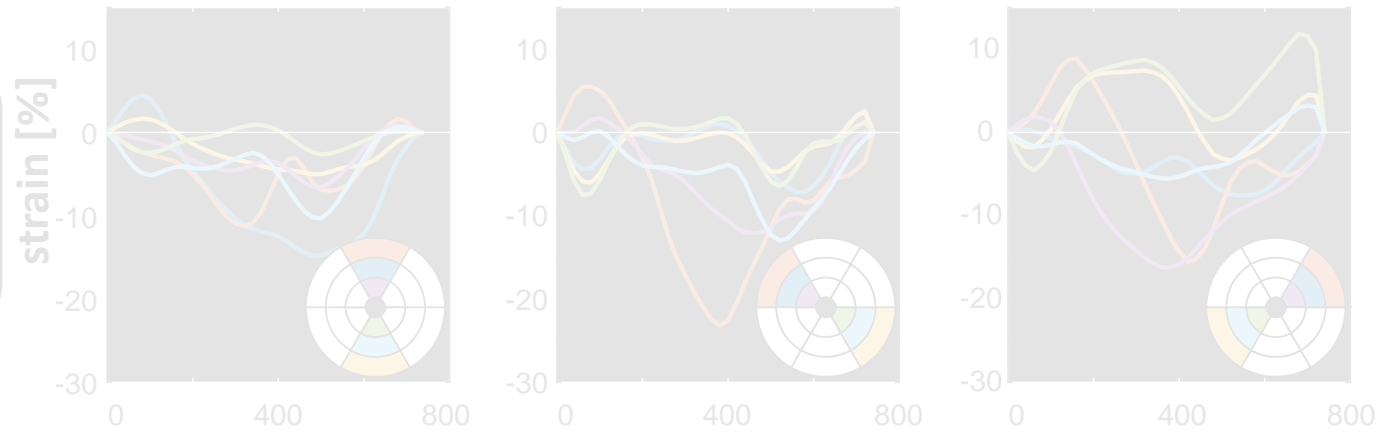
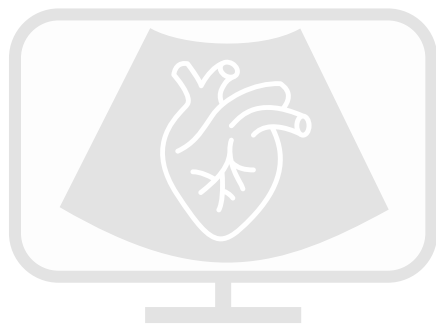


# DIGITAL TWIN

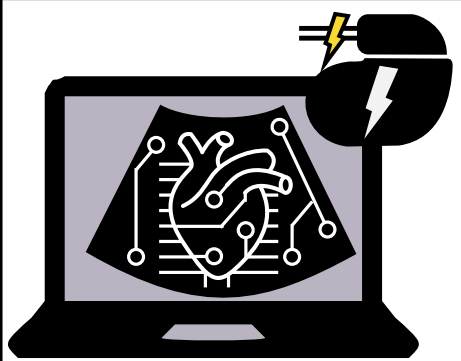




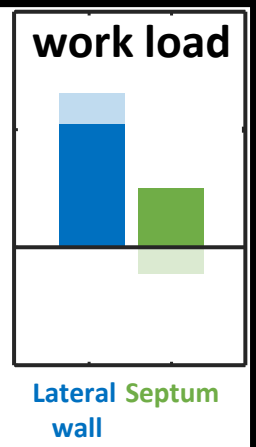
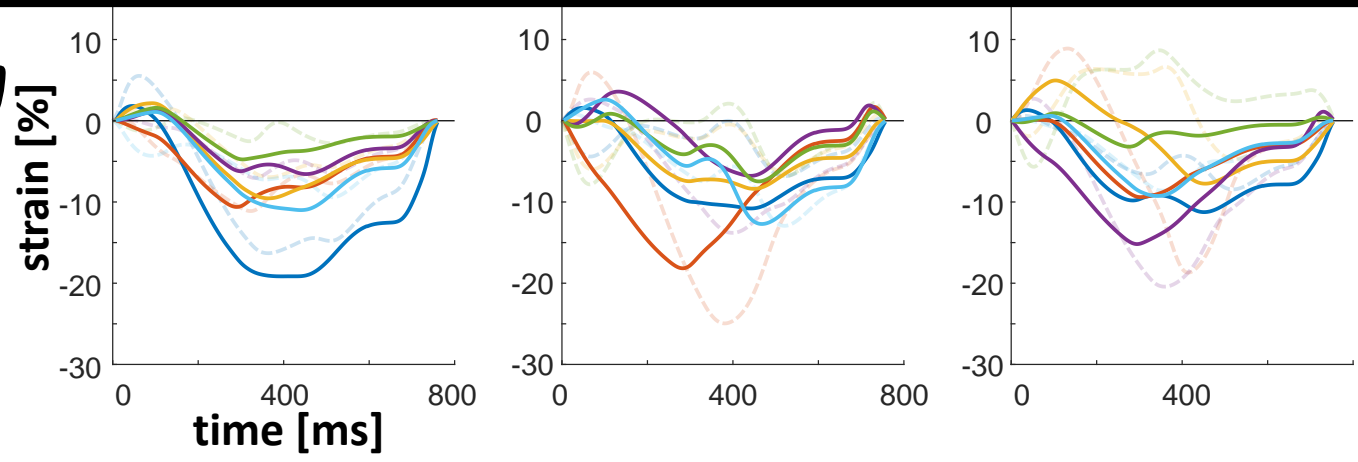
# REAL PATIENT



# virtual CRT



# DIGITAL TWIN



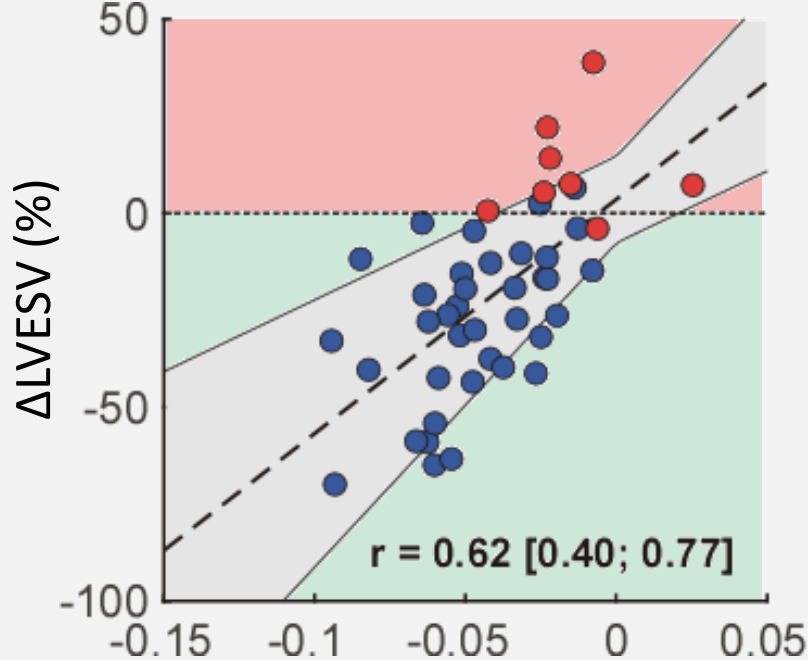


# Digital Twins enable CRT response prediction: *a reflection on guidelines*

## ESC 2013

Brignole et al. Eur Heart J, 2013

REAL PATIENT



DIGITAL TWIN

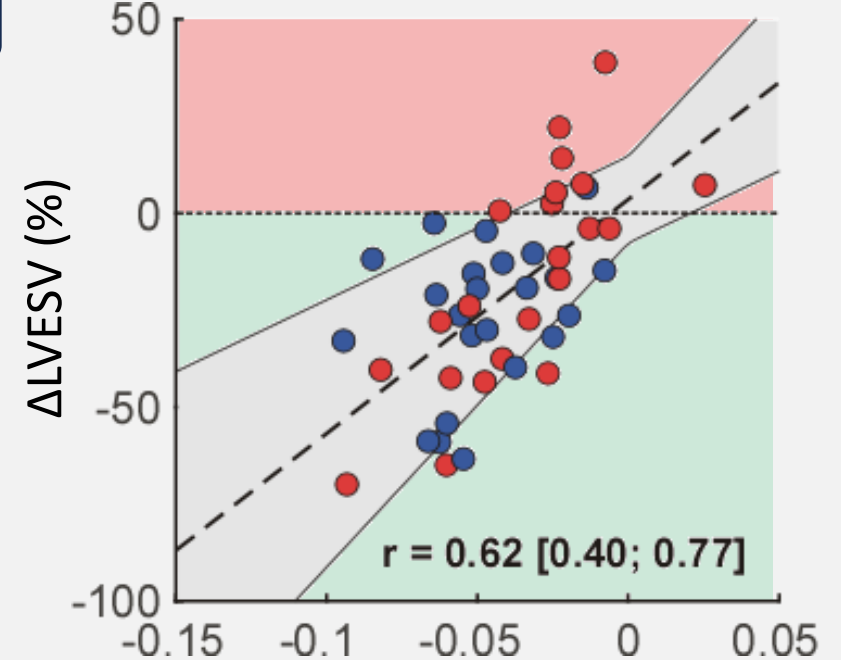
pacing-induced work redistribution (J)

- Class I indication
- Class IIa/IIb indication

## ESC 2021

Glikson et al, Eur Heart J, 2021

REAL PATIENT



DIGITAL TWIN

pacing-induced work redistribution (J)



## Conclusion II



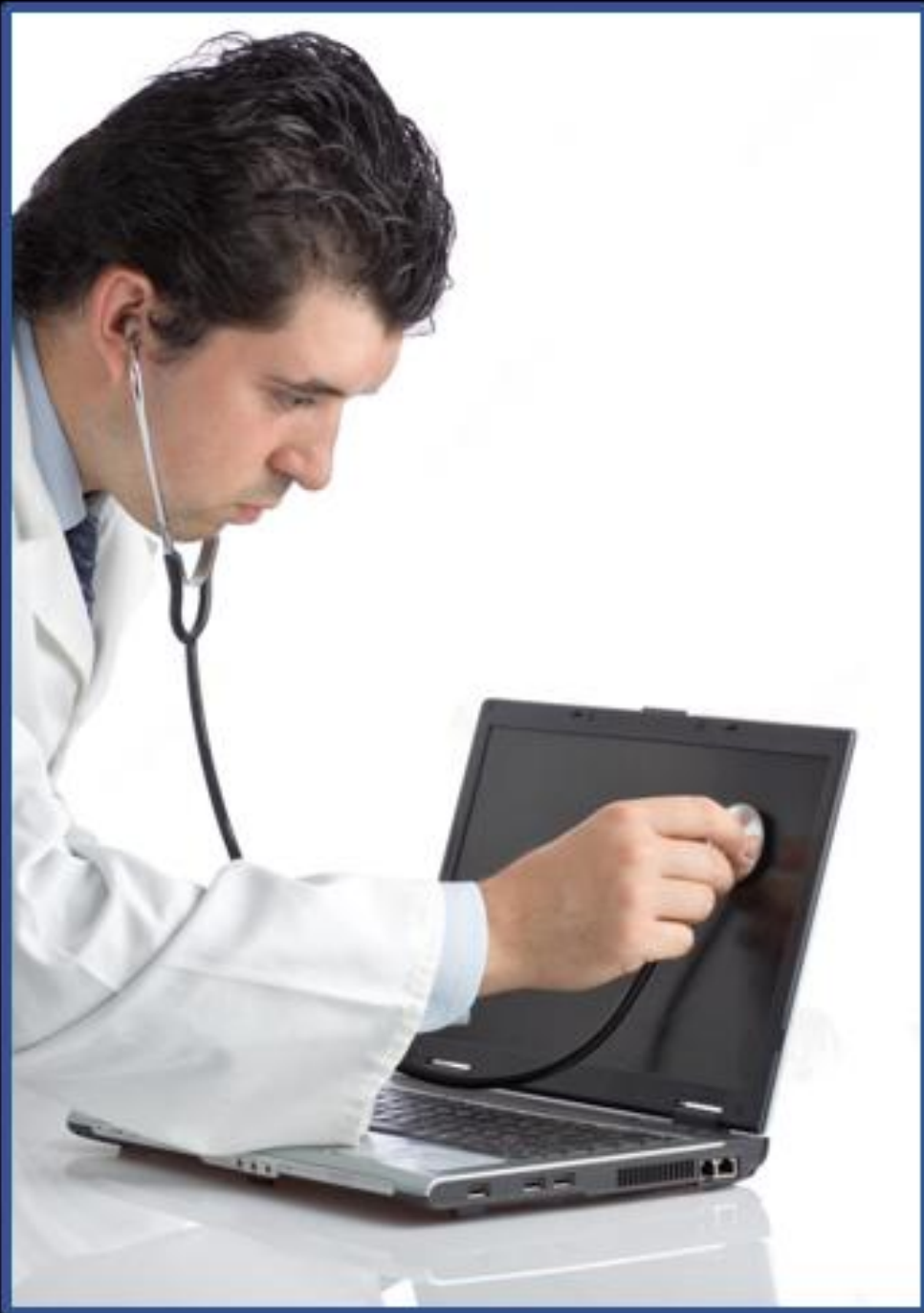
### **FORWARD**

Biophysical models of the human heart and circulation can improve our understanding of (imaging-derived) phenotypic characteristics of the failing heart. Models can be used for hypothesis generation / evaluation.

### **INVERSE**

Integration of imaging-based diagnostic information in a personalised biophysical model (Digital Twin) can expose 'hidden' disease substrates that would remain concealed otherwise and predict therapy outcome.

# The patient's virtual heart is coming to life



echo, ECG, blood pressure, etc.



in silico phenotyping

ventricular function  
atrial function  
valvular function  
electrical function  
vascular function  
etc.



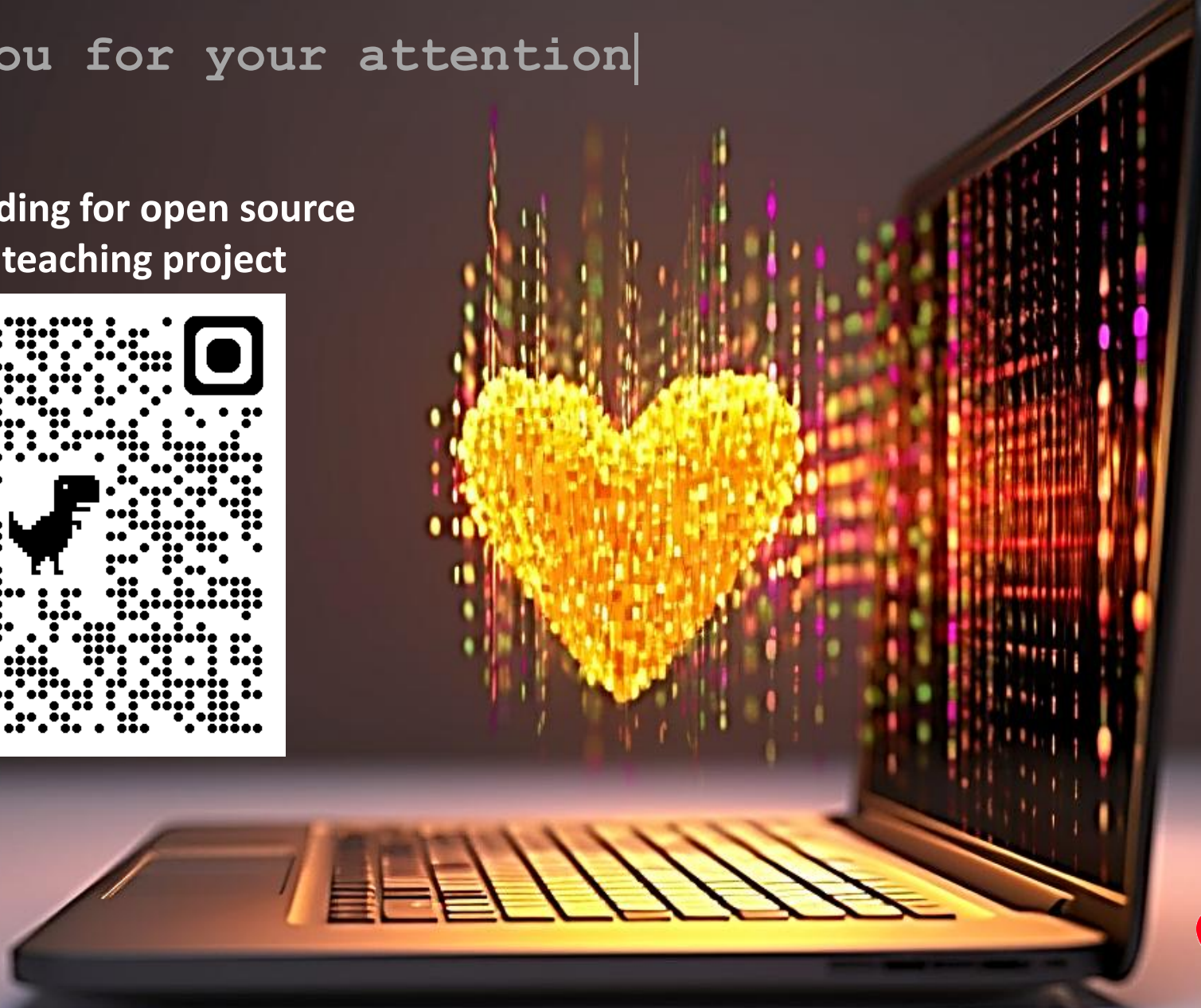
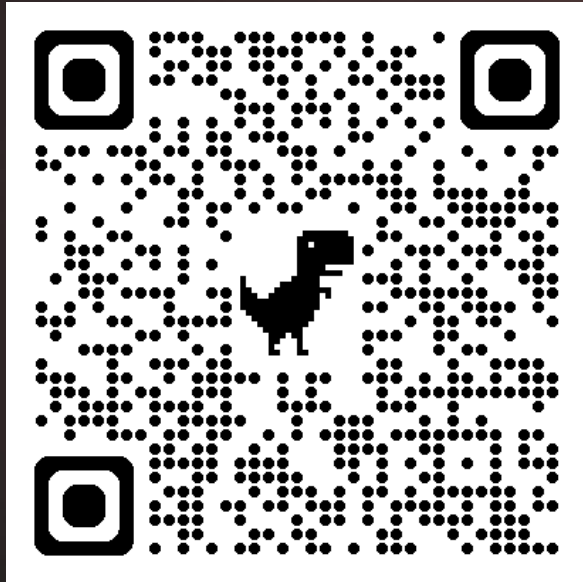
virtual stress test



virtual therapy

>> thank you for your attention|

UM crowdfunding for open source  
CircAdapt teaching project



VISIT  
[www.circadapt.org](http://www.circadapt.org)



*funded by the  
dutch heart foundation*

**Hartstichting**



**prof. dr. ir. Joost Lumens**  
*Professor of Computational Cardiology*

 **Maastricht UMC+**

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