

# Accuracy of Stroke Volume Estimation from Blood Pressure Measurement

via Reservoir Pressure Concept and  
Three Element Windkessel Model

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# Introduction

Cardiac and circulatory disease are the largest cause of death in the western world, and are the leading cause of ICU admission and mortality (WHO Global report)

- Expected to **increase** with increasing elderly population
- **1 in every 3 deaths** are related to cardiovascular disease
- Accounts for **30%** of all ICU admissions (and mortality)

Patients with cardiovascular disease require hemodynamic monitors to obtain patient information for diagnosis and treatment

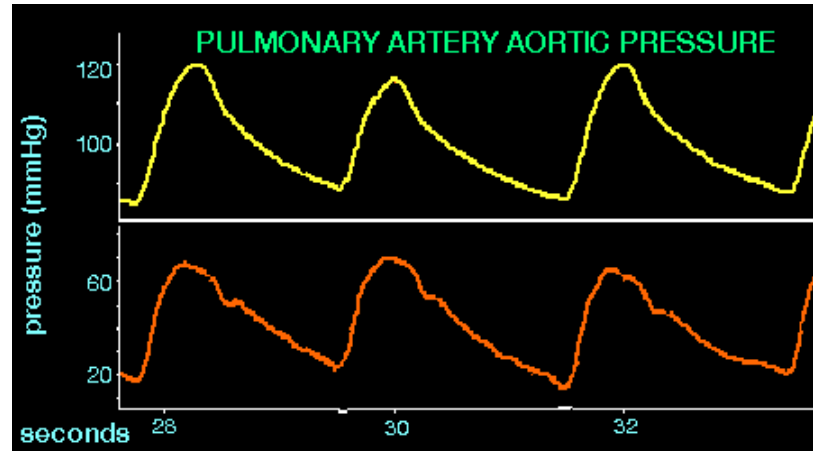


# Hemodynamic Monitors

*Pressure catheter*



*Blood pressure displayed on monitor*



## Blood Pressure Value?

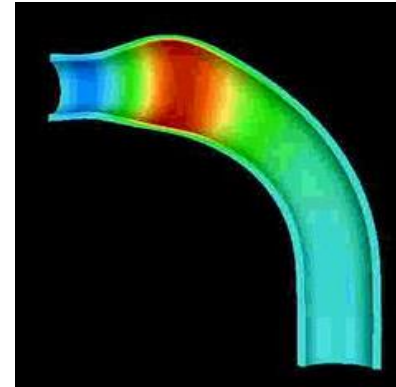
Main goal of cardiovascular support/treatment is to maintain adequate cellular perfusion and delivery of oxygen.

Pressure = Supply ?

# Cardiovascular Physiology

## Blood Vessels / Pressure / Flow

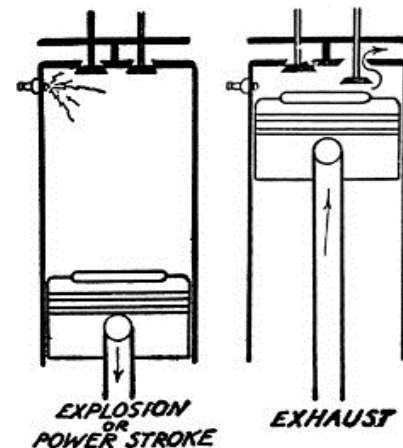
Pressure inside the artery depends not only on Volume, but also on Compliance. Flow through the artery depends on downstream Resistance



Pressure  $\neq$  Supply

## Stroke Volume

Amount of blood pumped from the heart each beat. **Better metric to assess cardiovascular performance and perfusion.**



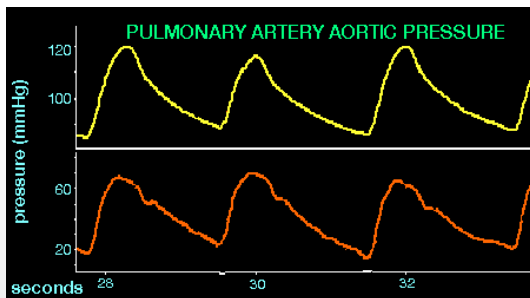
# How to Measure SV?

## Difficulties

- “Humans are horribly variable”  
(J.L Dickson et al)
- Direct measurements are highly invasive and clinically not feasible

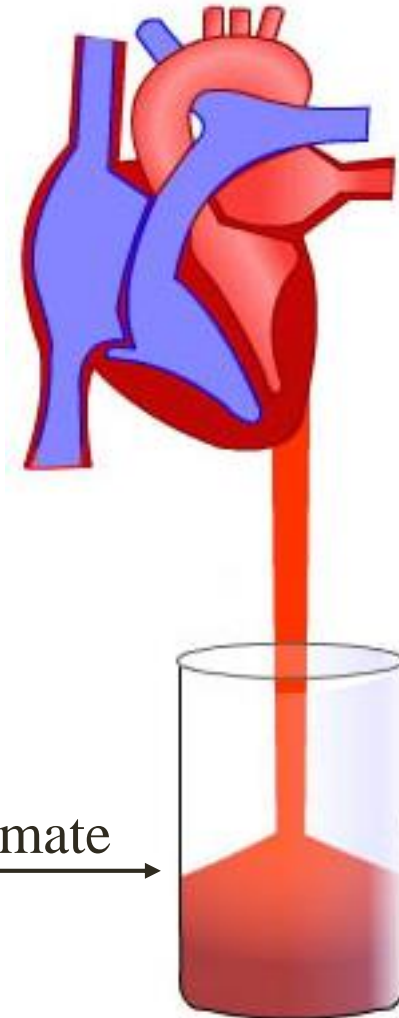
## Method

A model-based analysis of blood pressure waveform to estimate Stroke Volume.



Analyse  
Pressure  
Contour

Estimate



# Aortic Pressure Model

## Reservoir pressure concept

Aortic pressure ( $P_{ao}$ ) can be represented as the sum of two pressure components

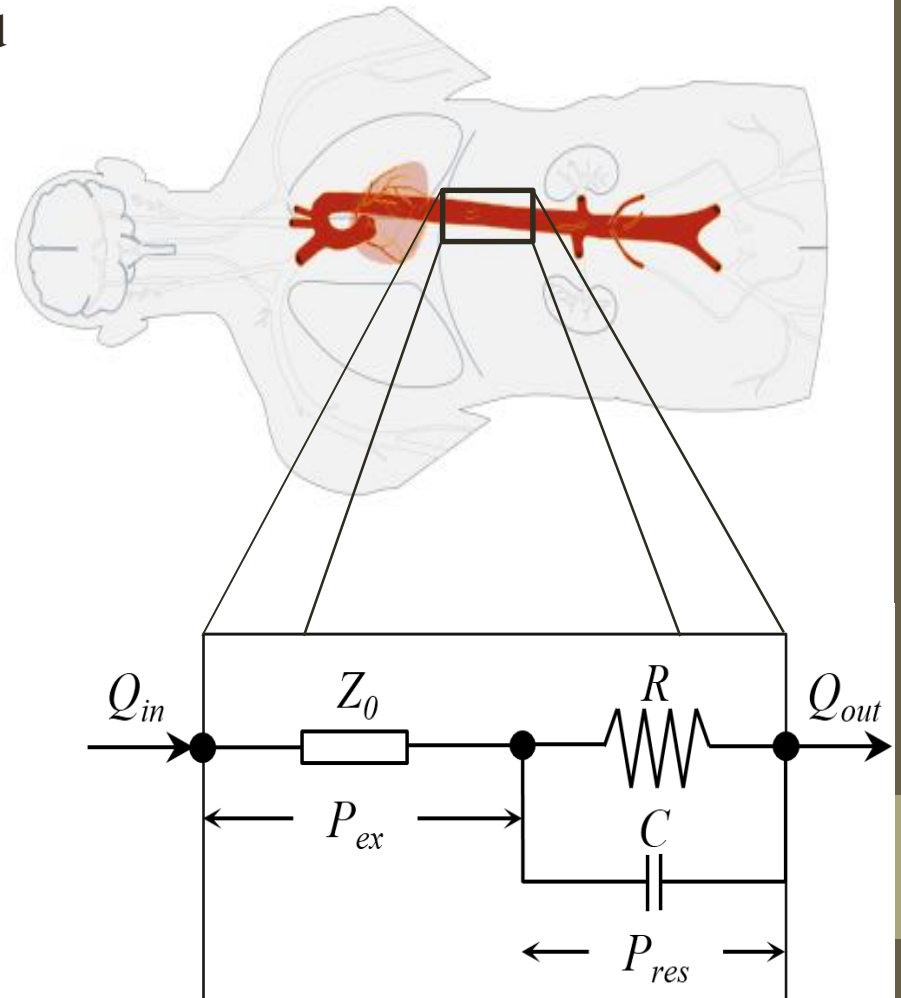
1. **Reservoir pressure ( $P_{res}$ )** accounts for the energy stored/released by the arterial wall
2. **Excess pressure ( $P_{ex}$ )** which is linearly proportional to  $Q_{in}$

$$P_{ao}(t) = P_{res}(t) + P_{ex}(t)$$

$$P_{ex}(t) \propto Q_{in}(t)$$

## Three Element Windkessel

- $Z_0$  - Characteristic impedance  
 $R$  - Peripheral resistance  
 $C$  - Aortic compliance



# Model Element Relationships

## Reservoir Pressure

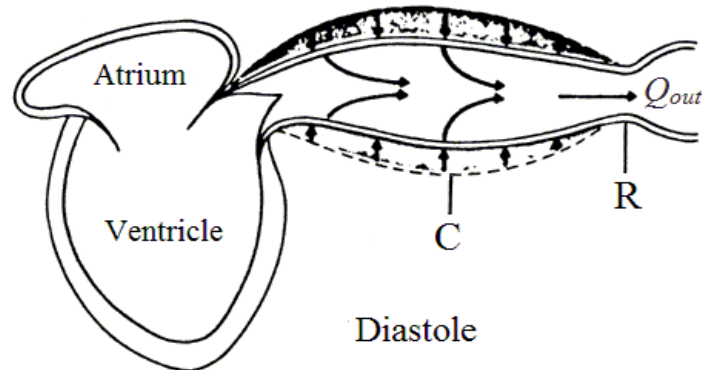
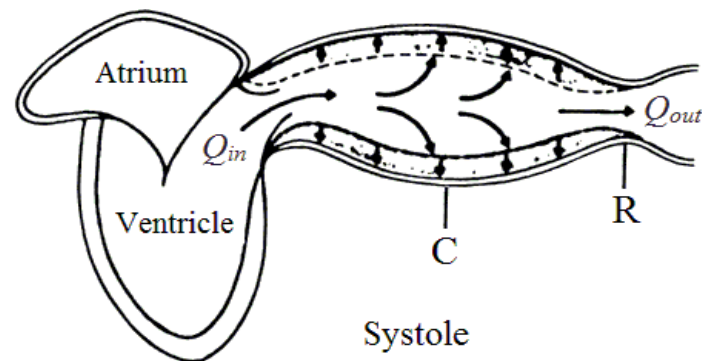
$$\frac{dP_{res}(t)}{dt} = \frac{Q_{in}(t) - Q_{out}(t)}{C}$$

## Flow Leaving Aorta

$$Q_{out}(t) = \frac{P_{res}(t) - P_{msf}}{R}$$

## Combine

$$\frac{dP_{res}(t)}{dt} = \frac{P_{ao}(t) - P_{res}(t)}{Z_0 C} - \frac{P_{res}(t) - P_{msf}}{RC}$$



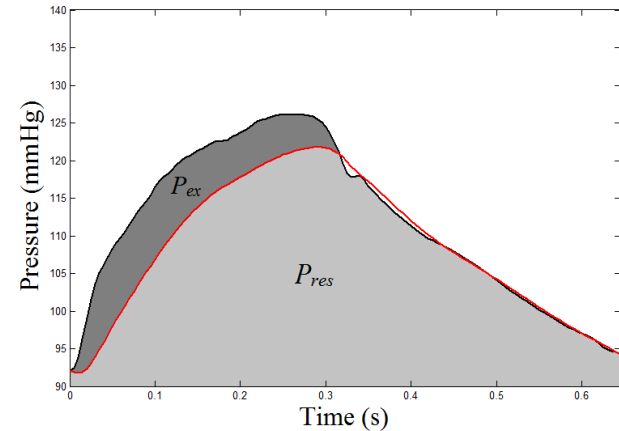
# Stroke Volume Estimation

## Three estimates of SV can be made

$$1 \quad SV_R = \frac{1}{R_{\text{subject}}} \int_{\text{one beat}} (P_{\text{res}}(t) - P_{\text{msf}}) dt$$

$$2 \quad SV_c = \frac{C_{\text{subject}}}{RC_{\text{identified}}} \int_{\text{one beat}} (P_{\text{res}}(t) - P_{\text{msf}}) dt$$

$$3 \quad SV_{z0} = \frac{1}{Z_{0,\text{subject}}} \int_{\text{one beat}} P_{\text{ex}}(t) dt$$



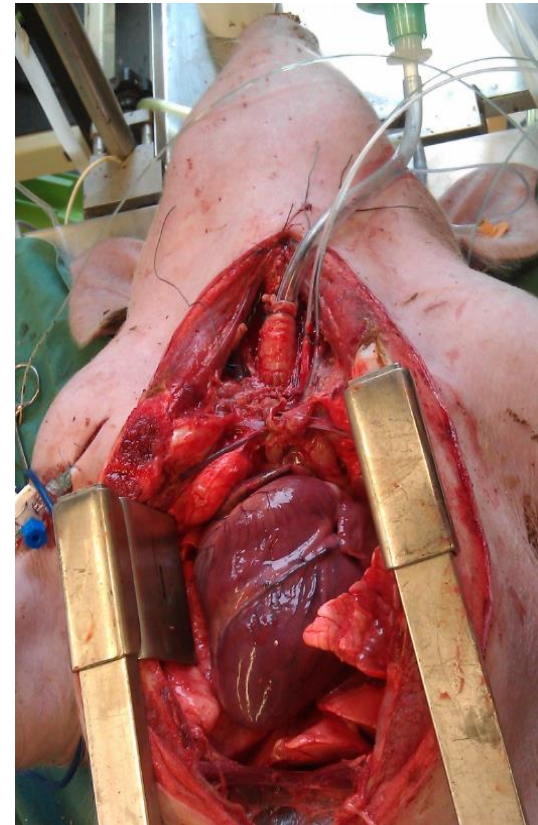
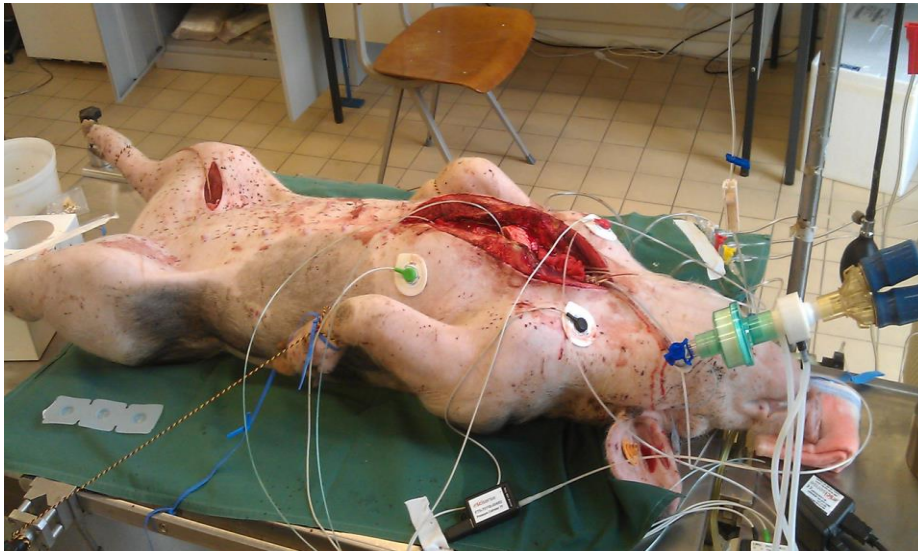
## Subject-specific physiological parameters

$$[R, C, Z_0] = \underset{[R, C, Z_0]}{\operatorname{argmin}} \left( \sum_{i=1}^{\text{number of beats}} \operatorname{abs}(SV_{\text{measured},i} - SV_{\text{estimated},i}) \right)$$



# Experiment

To validate SV estimation via aortic pressure model, data from porcine experiment were used.



**GIGA Cardiovascular  
Science**

**Université  
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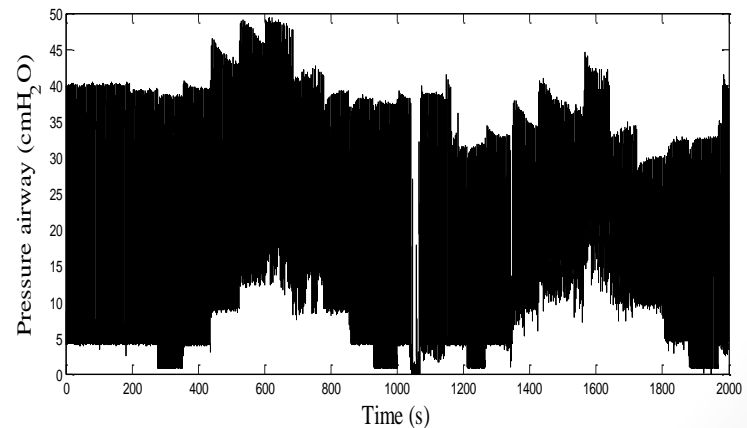
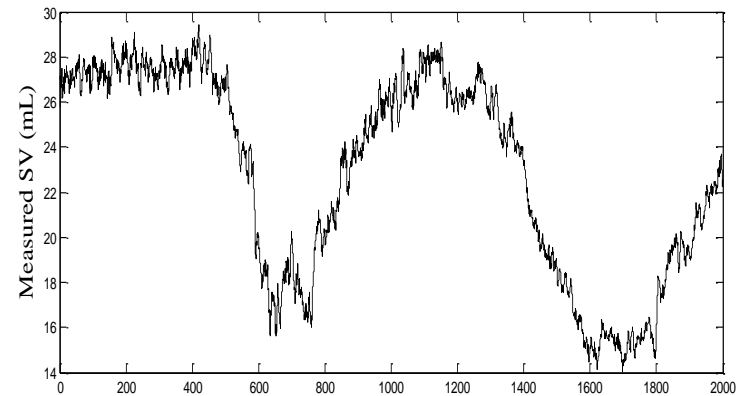
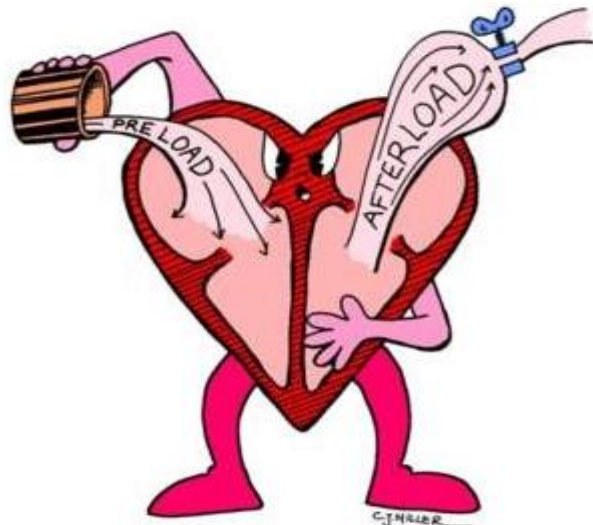
# Stroke Volume Changes

## Mechanical ventilation settings

Step-wise changes in positive end expiratory pressure were made

## Preload

Airway pressure increase and decrease changes the **amount of blood flowing into the ventricle** during diastole.



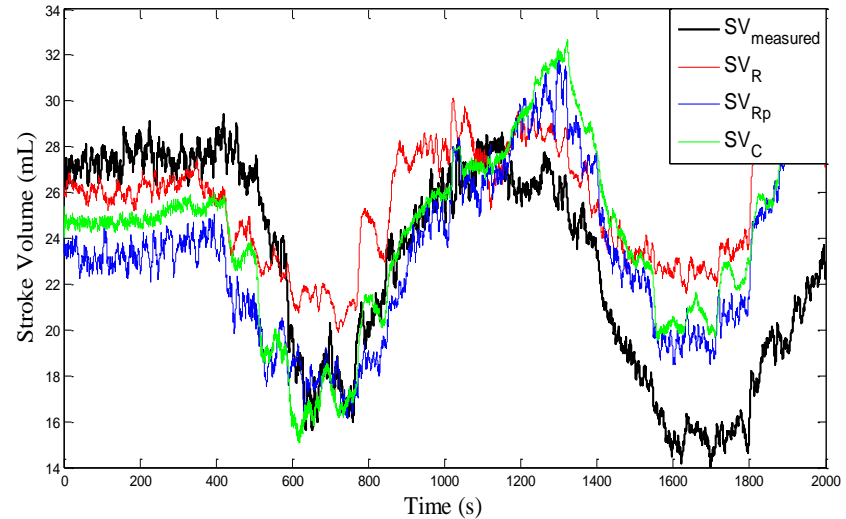
# Results

## Pig-specific physiological parameters

Pig No	R (mmHg.s/ml)	C (ml/mmHg)	Z <sub>0</sub> (mmHg.s/ml)
Pig 1	1.2104	0.6363	0.0825
Pig 2	2.1353	0.3837	0.1333
Pig 3	0.7008	0.9930	0.0395

## Stroke Volume Accuracy

Pig No	Bland-Altman results ( ml)		
	$\Delta SV_R$	$\Delta SV_C$	$\Delta SV_{Z_0}$
Pig 1	0.9 [-11.4, 13.3]	-1.1 [-15.5, 8.1]	0.6 [-10.6, 12.3]
Pig 2	3.9 [-6.5, 8.7]	1.0 [-7.7, 5.1]	2.7 [-5.6, 8.6]
Pig 3	-2 [-7.2, 12.5]	-0.4 [-12.8, 10.8]	0.2 [-11.0, 15.0]
All Pigs	2.0 [-10.5, 12.9]	0.6 [-13.3, 8.0]	1.5 [-9.9, 12.0]
<b>Overall Average:</b>			
<b>1.4 [-11.3, 12.2]</b>			



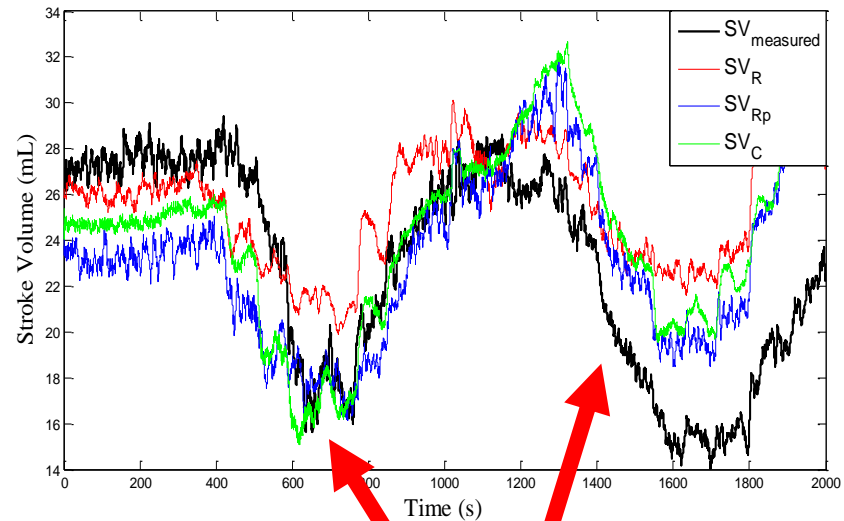
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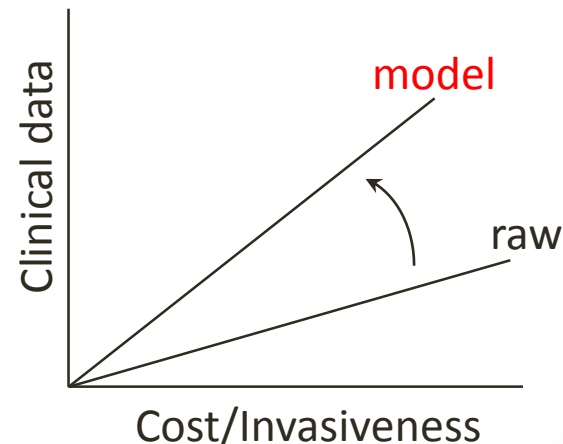


## Trend Accuracy

Pig No	Correlation Value (R value)		
	R	C	Z <sub>0</sub>
Pig 1	0.68	0.60	0.45
Pig 2	0.65	0.86	0.68
Pig 3	0.66	0.85	0.67
<b>Overall</b>	<b>0.66</b>	<b>0.77</b>	<b>0.60</b>

# Clinical Benefit

- Patients cardiovascular performance can be analysed more accurately than just Mean Arterial Pressure (MAP)
- Stroke volume trend can be used to guide treatment selection and to titrate therapy
  - Fluid resuscitation
  - Use of inotrope and vasoactive drugs
- Does not require specialised equipment and/or personnel



# Limitation & Future Work

- Change in physiological parameters ( $R$ ,  $C$ ,  $Z_0$ )
  - Multiple pressure measurements
  - Could one of the three estimate be more reliable measure depending on the patient condition
  - Are changes in value/contour of separated pressure waveform related to changes in parameters
  
- Aortic pressure measurements (Highly Invasive?)
  - How much information can be retrieved from radial arterial pressure

# Acknowledgement

This work was supported by EU FP7 IRSES (FP7-PEOPLE-2012-IRSES) program, project title: eTime - Engineering Technology-based Innovation in Medicine, Grant No. 318943.

# Acknowledgement

Supervisors

Bioengineering Centre

Medical Team at Liege

## Questions?

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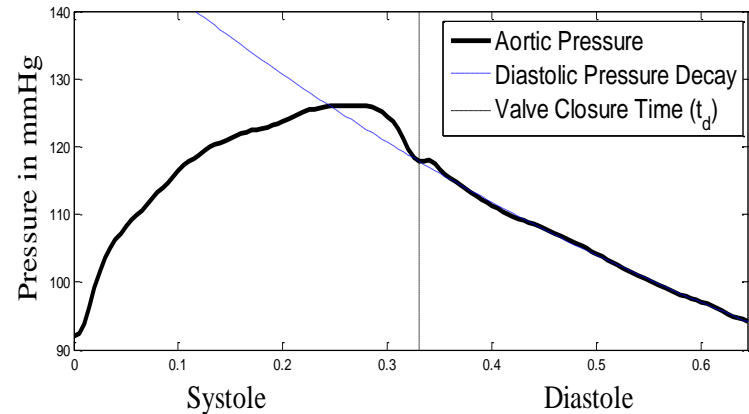
# Parameter Identification

## RC & $P_{msf}$

**Diastolic Condition:**  $P_{res}(t) = P_{ao}(t)$   
 Since  $Q_{in} = 0$

## Diastolic Reservoir

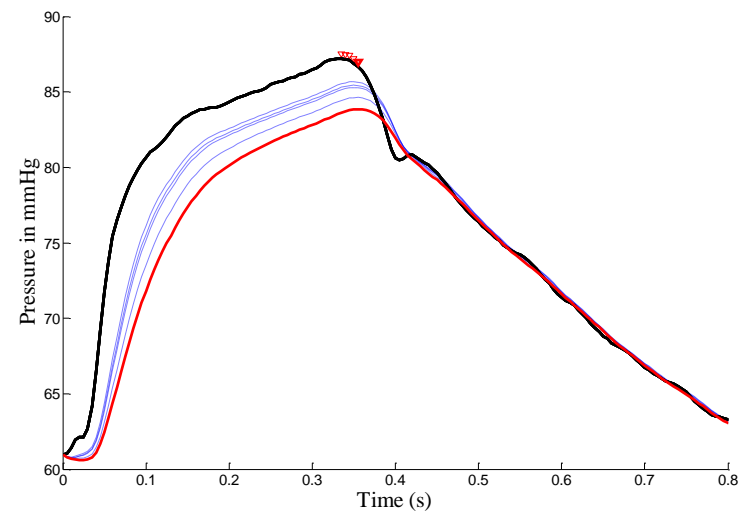
$$P_{res}(t) = (P_{ao}(t_d) - P_{msf})e^{-\frac{(t-t_d)}{RC}} + P_{msf}$$



## ZoC

**Equilibrium Condition:**  $\frac{dP_{res}(\tau)}{dt} = 0$

$$P_{res}(\tau) = \frac{RC P_{ao}(\tau) + Z_0 C P_{msf}}{Z_0 C + RC}$$



## ODE

$$\frac{dP_{res}(t)}{dt} = \frac{P_{ao}(t) - P_{res}(t)}{Z_0 C} - \frac{P_{res}(t) - P_{msf}}{RC}$$