

# Identifiability of a reduced model of pulsatile flow in an arterial compartment

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**Abstract**—In this article we propose a reduced model of the input-output behaviour of an arterial compartment, including the short systolic phase where wave phenomena are predominant. The objective is to provide basis for model-based signal processing methods for the estimation from non-invasive measurements and the interpretation of the characteristics of these waves. Standard space discretizations of distributed models of the flow lead to high order models for the pressure wave transfer function, and low order rational transfer functions approximations give poor results. The main idea developed here to circumvent these problems is to explicitly use a propagation delay in the reduced model. Due to phenomena such that peaking and steepening, the considered pressure pulse waves behave more like solitons generated by a Korteweg de Vries (KdV) equation than like linear waves. So we start with a quasi-1D Navier-Stokes equation that takes into account a radial acceleration of the wall, in order to be able to recover, during the reduction process, the dispersive term of KdV equation which, combined with the nonlinear transport term gives rise to solitons. The radial and axial acceleration terms being supposed small, a multiscale singular perturbation technique is used to separate the fast wave propagation phenomena taking place in a boundary layer in time and space described by a KdV equation from the slow phenomena represented by a parabolic equation leading to two-elements windkessel models. Some particular solutions of the KdV equation, the 2 soliton solutions, seem to be good candidates to match the observed pressure pulse waves. They are given by close form formulae involving propagation delays that are proposed to represent input and output wave shapes. Some very promising preliminary comparisons of numerical results obtained along this line with real pressure data are shown.

## I. INTRODUCTION

**Reduced mathematical models of the cardiovascular system.** The cardiovascular system can be seen as consisting of the heart, a complex double chamber pump, pumping the blood into vessels organized into vascular compartments forming a closed circulation loop. This point of view is useful for building models of the whole system as interconnection of simpler subsystem models. Such reduced mathematical models are usually a set of coupled ordinary differential equations, each of them representing the input-output behaviour of a subsystem: conservation law of the blood quantity for short time-intervals and specific behaviour laws. They can be used for understanding the global hydraulic behaviour of the system during a heartbeat. They can also be used to study the short-term control by the autonomous nervous system [16], [14], [11].

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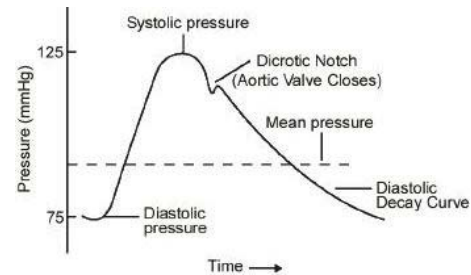


Fig. 1. Proximal arterial blood pressure waveform

**Description of the arterial blood pressure (ABP) waveform.** In this paper we are interested by models of the ABP as a fonction of space and time between proximal (i.e. close to the aortic valve) and distal (say at the finger) sites. The normal proximal ABP waveform is shown in Figure 1. The systolic upstroke of the pressure pulse is produced by left ventricular contraction. When the aortic valve closes, a temporary retrograde flow of blood against the valve cusps causes a decrease in aortic pressure, the dicrotic notch, at the beginning of diastole. As the pressure pulse is travelling forward in the arterial tree, it presents "peaking" and "steepening" and the dicrotic notch appears lower on the diastolic curve at more distal sites (Figure 2). The shape and amplitude of the diastolic curve after the dicrotic notch change with arterial compliance and peripheral resistance, this is the windkessel effect.

**Windkessel models of the input impedances of vascular compartments.** Input-output models of vascular compartments are 0D models (differential equations with no space variable) used in the above-mentioned models of the cardiovascular system. Also called windkessel models, they have been intensively studied because they can be useful to define global characteristics of vascular compartments with a small number of parameters having a physiological meaning. The first results of this type go back to Stephen Hales [5] who measured blood pressure in a horse by inserting a tube into a blood vessel, allowing the blood to rise up the tube. Measuring the heart rate and the capacity of the left ventricle, he was able to estimate the output of the heart per minute, and then the resistance to flow of blood in the vessels, the ratio of the pressure over the flow. Considering the dynamical behaviour of pressure, led Otto Frank in 1899 [4] to propose the original two-element windkessel model to represent the seemingly exponential decay of pressure in the ascending aorta during diastole, when the input flow

is zero. The time constant of this exponential decay is the product of the two elements of the model: the peripheral resistance,  $R_p$ , and the total arterial compliance,  $C$ . This model is analog to an electrical circuit, a two-port network with a parallel resistor  $R_p$  and a parallel input capacitor  $C$ . The input impedance is given by  $Z_{in} = \frac{R_p}{1+j\omega R_p C}$ . Since these first results, windkessel models with three or four elements have been introduced to represent more precisely the high-frequency behaviours of input impedances when it became possible to measure them [20]. The main observation leading to the three-element windkessel model is that the input impedance at high frequencies is close to a constant resistance  $R_c$  (constant modulus and zero degrees phase angle) that can be interpreted as the characteristic impedance of the compartment. The two-element model is then corrected as follows:  $Z_{in} = R_c + \frac{R_p}{1+j\omega R_p C}$ . But now, for low frequencies  $Z_{in}$  is close to  $R_c + R_p$  instead of  $R_p$ , an error corrected by adding a fourth element, an inertance  $L$  in parallel with  $R_c$ , so that  $Z_{in} = \frac{j\omega R_c L}{R_c + j\omega L} + \frac{R_p}{1+j\omega R_p C}$ . Usually  $L$  is interpreted as the total inertance of the arterial system. Good estimations from aortic pressure and flow measurements, of the input impedance of the entire systemic tree, and in particular of the total arterial compliance have been obtained using this four-element windkessel model [20].

**Windkessel models and linear transmission line concepts.** The linear transmission line theory is underlying the developments of windkessel models. The arterial systemic compartment can be seen as a multi-port network coupling the heart to the extremities of the arterial tree through series of vessel bifurcations. When modelling the aorta input impedance, three situations are considered [20]: for very low frequencies (under the heart rate), the input impedance is close to the equivalent resistance  $R_p$  of the very distal parts of the arterial tree (arterioles and small arteries); for low frequencies (under the heart rate) the input impedance decreases due to the distributed compliance  $C$  and inertance  $L$ . Remark that  $\frac{1}{\sqrt{LC}}$  is the wave velocity. Finally, for medium to high frequencies (above two times the heart rate), reflections in the proximal aorta can be neglected, so that, as in the case of a reflectionless line, the input impedance equals the characteristic impedance of the ascending aorta (a constant resistance for high frequencies). This reflectionless property does not seem to be limited to high frequencies. As noticed in [21]: "Indeed, Milnor [10] remarked that the properties of the aortic tree in the normal young animal are those of an almost perfect diffuser (i.e., it generates far fewer reflections than the best man-made distribution network)". We will come back on this property later. Estimating ascending aortic pressure from a distal pressure waveform is of particular interest in the case of a non-invasive distal measurement, for example for a distal pressure measured at the finger. Having in mind the linear transmission line concepts, the problem is to estimate an input-output transfer function between proximal and distal pressures. Several methods have been proposed ([6], [19]) but some important limitations appear when 0D models are used to represent the relations between

distant signals [9]. This is not surprising because rational transfer functions have been used but the transmission line, in this case, behaves like a delay-line: an infinite dimensional system. We will propose a solution for this problem, based on some kind of nonlinear transmission line concepts.

**Multiscale modelling of the cardiovascular system.** Windkessel models are also used as models of the loads of the heart or of the arteries in some multiscale computations where they appear as boundary conditions of partial differential equations (PDE) when distributed models of the heart [1], [18] or of vessels [17] are used. In the case of vessel modelling, the question arises of the consistency of the lumped models with models taking into account one, two or three space variables to represent, apparently, the same vessels. It is discussed in [8] in the 1D case: a series of well chosen windkessel-like models can be used as a semi-discrete approximation of the linearized flow equations, while a single windkessel model can be used when it is possible to neglect the variations in space of pressure and flow (hypothesis (9) in [8]), a limitation that is not surprising for 0D models and seems valid after the pressure pulse wave has propagated through the arterial tree. So windkessel models appear as low frequency approximations of the input impedances of the downstream compartments loading the studied element (heart or vessel). In [13], as a result of a direct spectral analysis of the linearized flow equations, the number of elements of the windkessel model is chosen in relation with the order of this low frequency approximation. These theoretical results are an explanation of the good experimental results reported for example in [20]. Remark that if one is interested by the transmission line transfer function, the approximation by a long series of windkessel models provided by this PDE approach is not a reduced model.

**Reduced models of the arterial compartments based on nonlinear waves.** In this article we propose reduced models of the input-output behaviour of vascular compartments, including the short systolic phase (about 100 ms) where wave phenomena are predominant. The long-term objective is to provide model-based signal processing methods for the estimation and interpretation of the characteristics of these waves (shape, velocity?), in order to assess the compartment function and the heart-compartment adaptation. As we have seen above, the PDE discretization approach leads to high order models for the Pressure Wave Transfer Function (PWTF). In what follow, the main idea to circumvent this problem will be to explicitly use a propagation delay, for example the Pulse Transit Time (PTT) that, in practice can be measured directly. A close look to the waves of interest leads to the hypothesis that they are indeed nonlinear waves. For example, during the travel of a pressure pulse from the heart towards a finger, it is easy to observe an increase of the pulse amplitude and a decrease of its width (peaking and steepening phenomena), at the opposite of what would be expected of linear weakly damped waves. Comparing the shapes of such pressure pulse wave, when it is close to the heart and when at the finger, it seems possible to interpret the downstream shape as a deformation of the upstream one

due to higher velocities for higher peaks during the travel: this is particularly striking for the dichrotic wave. All these qualitative phenomena leads to consider the pulse wave as a solitary wave, for example generated by a Korteweg de Vries equation for the flow. After this systolic phase a windkessel model will be able to represent the waveless phenomena as in [21]. These remarks are not new, but we want here to precise the corresponding computations, in particular the type of solitary waves, in order to be able to propose signal processing techniques. In a first part a quasi-1D Navier-Stokes equation is studied that takes into account a radial acceleration. The radial and axial acceleration terms being supposed very small and small respectively, a multiscale singular perturbation technique is used to isolate the fast wave propagation phenomena taking place in a boundary layer in time (and space) and the slow phenomena represented by a parabolic system similar to those studied for example in [11] or [8] and leading to two-elements windkessel models. For the hyperbolic system in the boundary layer, the situation is similar to those leading to Korteweg de Vries equation when a direction of the solitary waves is chosen, which corresponds to the matching condition of the linear case. For example, using various asymptotic methods, Yomosa and Demiray [23], [3] studied the motion of weakly nonlinear pressure waves in a thin nonlinear elastic tube filled with an incompressible fluid. They proved that, when viscosity of blood is neglected, the dynamics are governed by the Korteweg-de Vries equation. We adapt this technique in the second part. In a third part we study particular solutions of the Korteweg-de Vries equation, namely the 2-soliton solutions that seem to be good candidates to match the observed pressure pulse waves. Finally we show the first comparisons of numerical results obtained along this line with real pressure data.

## II. ASYMPTOTIC EXPANSION OF A QUASI 1D MODEL OF FLOW : QUASISTATIC APPROXIMATION AND KdV CORRECTOR.

In this section, we derive the Korteweg-de Vries equation in a boundary layer, governing the motion of blood flow in large arteries.

The idea of a boundary layer where a corrector of the motion of the fluid satisfies a KdV equation is a conjecture to represent the wave phenomena rather fast when compared to the windkessel effect. We derive formally the equations satisfied by this corrector.

We suppose that the arteries can be identified with an elastic tube, and blood flow is supposed to be an incompressible fluid. Moreover, we neglect the viscosity of the blood in the large arteries and will only consider it in the outflow boundary condition (peripheral impedance), leading to the windkessel model.

Thus, we consider a one dimensional elastic tube of mean

radius  $R_0$ . The Navier Stokes equation can read as

$$A_T + Q_Z = 0, \quad (1)$$

$$Q_T + \left( \alpha \frac{Q^2}{A} \right)_Z + \frac{A}{\rho} P_Z = 0. \quad (2)$$

where,  $Z$  and  $T$  are the spatial and time variables,  $A(T, Z) = \pi R^2(T, Z)$  is the cross-sectional area of the vessel,  $Q(T, Z)$  is the blood flow and  $P(T, Z)$  is the blood pressure. Moreover  $\rho$  is the blood density,  $\alpha$  is the momentum-flux correction coefficient.

Furthermore, the motion of the wall satisfies, (see for example [23])

$$\frac{\rho_w h_0 R_0}{A_0} A_{TT} = (P - P_e) - \frac{h_0}{R_0} \sigma \quad (3)$$

where,  $\rho_w$  is the wall density,  $P_e$  is the pressure outside the tube,  $h_0$  denotes the mean thickness of the wall. Moreover,  $\sigma$  is the extending stress in the tangential direction.

**Remark 2.1** Usually the term  $\frac{\rho_w h_0 R_0}{A_0} A_{TT}$  is neglected because  $A_{TT}$  is small.  $\diamond$

This system is completed by a model of the local compliance of the vessels, a state equation

$$\sigma = E \frac{\Delta A}{2A_0}. \quad (4)$$

where  $\Delta A = A - A_0$ , with  $A_0$  the cross-sectional area at rest, and  $E$  is the coefficient of elasticity.

First of all, we rewrite system (1)-(4) in non dimensional variables.

Let

$$Z = Lz, T = \frac{L}{c_0} t$$

where  $L$  is the typical wave length of the waves propagating in the tube,  $c_0 = \sqrt{\frac{Eh_0}{2\rho R_0}}$ , with  $R_0$  the means radius of the tube. The velocity  $c_0$  is the typical Moens-Korteweg velocity of a wave propagating in an elastic tube, when all nonlinear terms are neglected. we suppose  $P$  or  $Q$  given for  $z = 0$  along with a relation between  $P$  and  $Q$  for  $z = 1$ ,  $P = \mathcal{F}(Q)$  (peripheral impedance).

Moreover, we suppose that  $\varepsilon = \frac{R_0^2}{L^2} \ll 1$ . (This hypothesis is in good agreement with real data, we have  $\varepsilon \simeq 0.01$ ).

Let us rescale pressure, blood flow and cross-sectional area by,

$$\begin{aligned} P - P_0 &= \rho c_0^2 p, \\ Q &= A_0 c_0 q, \\ A &= A_0(1 + a), \end{aligned}$$

where  $A_0$  and  $P_0$  are the constant cross sectional area and the pressure reference, where  $Q_0 = 0$ . Thus, we get the following system,

$$\begin{aligned} a_t + q_z &= 0, \\ q_t + \left( \alpha \frac{q^2}{1+a} \right)_z + (1+a)p_z &= 0, \\ \frac{\rho_w h_0 R_0}{\rho L^2} a_{tt} + a &= p. \end{aligned}$$

By hypothesis,

$$\frac{\rho_w h_0 R_0}{\rho L^2} = \frac{\rho_w h_0 R_0^2}{\rho R_0 L^2} = O(\varepsilon) = \lambda \varepsilon.$$

Thus, we get,

$$a_t + q_z = 0, \quad (5)$$

$$q_t + \left( \alpha \frac{q^2}{1+a} \right)_z + (1+a)p_z = 0, \quad (6)$$

$$\lambda \varepsilon a_{tt} + a = p. \quad (7)$$

We suppose that the solutions admit an asymptotic expansion in terms of  $\varepsilon$ , i.e.,

$$a(t, z) = \sum_{k \geq 1} \varepsilon^k a^k(t - z, \varepsilon z), \quad (8)$$

$$p(t, z) = \sum_{k \geq 1} \varepsilon^k p^k(t - z, \varepsilon z), \quad (9)$$

$$q(t, z) = \sum_{k \geq 1} \varepsilon^k q^k(t - z, \varepsilon z). \quad (10)$$

We perform the following change of variables,

$$\tau = t - z, \quad \xi = \varepsilon z.$$

**Remark 2.2** This change of variables implies that we consider only waves moving from left to right. If we keep both directions, we get a Boussinesq type model as for example in [15].

Remark also that we have chosen a smaller scale,  $\varepsilon = \frac{R_0^2}{L^2}$  instead of  $\varepsilon = \frac{R_0}{L}$  commonly chosen [2], so that the small acceleration term in (7) does not disappear in the sequel.  $\diamond$

Thus equations (5)-(7) become (at the second order of  $\varepsilon$ ),

$$\varepsilon[-a_\tau^1 + q_\tau^1] + \varepsilon^2[a_\tau^2 + q_\xi^1 + q_\tau^2] = 0, \quad (11)$$

$$\varepsilon[-q_\tau^1 + p_\tau^1] + \varepsilon^2[-q_\tau^2 + 2q^1 q_\tau^1 + p_\xi^1 + p_\tau^2 + a^1 p_\tau^1] = 0, \quad (12)$$

$$\varepsilon[a^1 - p^1] + \varepsilon^2[\lambda a_{\tau\tau}^1 + a^2 - p^2] = 0. \quad (13)$$

From (11)-(13), it is normal to choose

$$q^1 = p^1, \quad (14)$$

$$a^1 = p^1, \quad (15)$$

$$2p_\xi^1 + 3p_\tau^1 p^1 + \lambda p_{\tau\tau}^1 = 0. \quad (16)$$

In initial variables, we have the following KdV equation for the fast pressure pulse,  $P^1 = \rho c_0^2 p^1$ , with (14)-(16)

$$P_Z^1 + d_0 P_T^1 + d_1 P^1 P_T^1 + d_2 P_{TT}^1 = 0, \quad (17)$$

with

$$\begin{aligned} d_0 &= \frac{1}{c_0}, \\ d_1 &= -(\alpha + \frac{1}{2}) \frac{1}{\rho c_0^3}, \\ d_2 &= -\frac{\rho_w h_0 R_0}{2\rho c_0^3}. \end{aligned}$$

**Remark 2.3** The blood flow,  $Q^1$ , and the cross sectional area  $\Delta A^1$  are also solutions of Korteweg-de Vries equations with some other parameters.  $\diamond$

**Remark 2.4** Usually, with the available measurements (e.g. given by a FINAPRES sensor), we get the pressure at a localized point, for example the finger, and as a function of time. Thus, it is useful to get, not a time-evolution equation but a space-evolution equation as obtained in (17).  $\diamond$

The equation (17) describes rather fast travelling waves (3-10 m/s). After these waves have gone across the compartment there is still a slowly varying flow that will appear as some kind of parabolic flow well approximated by a windkessel model.

Remark that the convergence in (8)-(10) is still an open question.

### III. MODELLING OF PULSATILE AND NON PULSATILE BLOOD FLOWS.

After studying different pressure pulse waves measurements, we clearly see that the pulses can be approximated by 2-soliton solutions. We recall that solitons are solitary waves solutions of the Korteweg-de Vries equation, see e.g. [7], [22]. Roughly speaking a n-soliton will have n components of different heights travelling with different velocities while interacting.

In the next subsection, we give the analytical expression of these soliton solutions we will use in the sequel.

#### A. The 2-soliton pressure model

Thanks to Lamb [7], we exactly know the analytical expression of a 2-soliton solution.

We first consider the following a-dimensional KdV equation

$$y_\xi + 6yy_\tau + y_{\tau\tau} = 0. \quad (18)$$

Then a 2-soliton solution of (18) can be written,

$$y(\xi, \tau) = 2 \frac{a_1^2 f_1 + a_2^2 f_2 + 2 \left( \frac{a_1 - a_2}{a_1 + a_2} \right)^2 (a_2^2 f_1^2 f_2 + a_1^2 f_1 f_2^2)}{(1 + f_1 + f_2 + \left( \frac{a_1 - a_2}{a_1 + a_2} \right)^2 f_1 f_2)^2} \quad (19)$$

with

$$\begin{aligned} f_j(\xi, \tau) &= \exp(-a_j(\tau - s_j - a_j^2 \xi)), \\ (a_j, s_j) &\in \mathbb{R}^2 \text{ and } a_1 > a_2 > 0. \end{aligned}$$

We have,

$$P^1(Z, T) = \frac{6d_2}{d_1} y(\xi, \tau).$$

Therefore,  $P^1$  is a solution of the pressure-pulse KdV equation (17), and we have

$$P^1(Z, T) = \frac{12d_2}{d_1} \frac{a_1^2 f_1 + a_2^2 f_2 + 2 \left( \frac{a_1 - a_2}{a_1 + a_2} \right)^2 (a_2^2 f_1^2 f_2 + a_1^2 f_1 f_2^2)}{(1 + f_1 + f_2 + \left( \frac{a_1 - a_2}{a_1 + a_2} \right)^2 f_1 f_2)^2}$$

$$\begin{aligned} \text{with } f_j(Z, T) &= \exp(-a_j(T - s_j - Z(d_0 + a_j^2 d_2))), \\ (a_j, s_j) &\in \mathbb{R}^+ \times \mathbb{R}. \end{aligned}$$



### B. Identifiability of 2-soliton representations.

In this subsection, we use the 2-soliton parameters of subsection III-A.

**Theorem 3.1:** If  $S$  is the initial data of a 2-soliton solution of

$$y_\xi + 6yy_\tau + y_{\tau\tau} = 0, \quad (20)$$

then  $\eta S$  is the initial data of a 2-soliton solution of (20) if and only if  $\eta = 1$ .

From Theorem 3.1, we easily deduce the following theorem about the identifiability of a 2-soliton-pressure.

**Theorem 3.2:** Suppose that for  $Z = 0$  the pressure  $P_0(T) = P_1(0, T)$  is known and is the initial data of a 2-soliton. Then for any other position  $Z \neq 0$ ,  $P_1(Z, T)$  is well defined as soon as we know the parameters  $d_0$  and  $d_2$ .

#### Proof of Theorem 3.1:

We look at the equivalent in space in  $+\infty$  and in  $-\infty$  of  $S$  a 2-soliton. By using Lamb formulae, [7], we get the following equivalents, by letting  $a_1$  and  $a_2$  the 2 parameters of  $S$  (see formula (19)) with  $a_1 < a_2$  and  $s_1$  the initial delay of the first component of the soliton.

$$S = 8 \frac{a_2^2 - a_1^2}{(a_2 - a_1)^2} a_1^2 e^{2(a_1 \tau + s_1)} \quad (+\infty)$$

$$S = 8 \frac{a_2^2 - a_1^2}{(a_2 - a_1)^2} a_1^2 e^{-2(a_1 \tau + s_1)} \quad (-\infty)$$

As  $\eta S$  is supposed to be a 2-soliton it must have the same equivalent in space in  $+\infty$  and in  $-\infty$ . Thus if we take  $b_1$  and  $b_2$  the 2 parameters of  $\eta S$  with  $0 < b_1 < b_2$  and  $r_1$  the delay, we get

$$8\eta \frac{a_2^2 - a_1^2}{(a_2 - a_1)^2} a_1^2 e^{2(a_1 \tau + s_1)} = 8 \frac{b_2^2 - b_1^2}{(b_2 - b_1)^2} b_1^2 e^{2(b_1 \tau + r_1)}$$

$$8\eta \frac{a_2^2 - a_1^2}{(a_2 - a_1)^2} a_1^2 e^{-2(a_1 \tau + s_1)} = 8 \frac{b_2^2 - b_1^2}{(b_2 - b_1)^2} b_1^2 e^{-2(b_1 \tau + r_1)}$$

We immediately deduce that  $b_1 = a_1$ , and  $r_1 = s_1$  and we obtain the following equation,

$$\eta \frac{a_2 + a_1}{a_2 - a_1} = \frac{b_2 + a_1}{b_2 - a_1}$$

By using the first conserved quantity of the KdV solution (see Lamb [7]), for the 2-soliton solutions  $S$  and  $\eta S$ , namely,

$$\int_{-\infty}^{+\infty} S(\tau, \xi) d\xi = C$$

we get,

$$\eta(a_2 + a_1) = b_2 + a_1$$

thus

$$a_2 = b_2, \quad \eta = 1$$

and we have exactly the same soliton which ends the proof of Theorem 3.1.

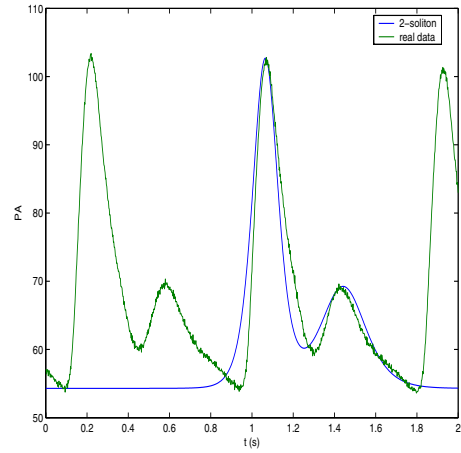


Fig. 2. Pressure obtained with a FINAPRES sensor and superposed with a 2-soliton model

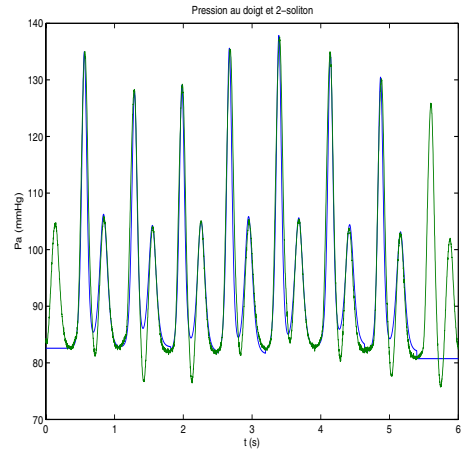


Fig. 3. Pressure obtained with a FINAPRES sensor and superposed with a 2-soliton model after a tilt test

## IV. DISCUSSION OF THE SOLITON REPRESENTATIONS OF REAL PRESSURE WAVES.

In Fig. 2, the 2-soliton is well adapted to represent the pressure pulse. Note that we have only superposed the 2-soliton to the second pressure wave in this case.

For the patient of Fig. 3, we don't need to correct the 2-soliton solution with a windkessel part. The heart rate is rather high after a tilt test, thus the windkessel effect doesn't appear.

Remark that we have obtained a good fit between measured and computed pressures using only forward waves.

The forward wave plus windkessel effect description given in the introduction is in general completed by describing the effect of wave reflections related to the narrowing and bifurcations of the arterial vessels and to peripheral resistances. The superposition of the forward and backward waves is then also invoked to explain observations like peaking or even the dicrotic notch. For example in [12], using an inflow boundary condition, a peripheral impedance model is shaped to obtain the dicrotic pressure notch. Wave reflection, like

windkessel effect, is also clinically useful to represent the left ventricular workload: in patients with elastic arteries, the reflected wave returns to the heart during the diastole and thus augments coronary artery perfusion. In patients with stiff, atherosclerotic vessels, it returns to the heart during systole and thus increases systolic pressure and left ventricular afterload.

## V. CONCLUSION

In this article we have proposed a reduced model of the input-output behaviour of an arterial compartment, including the short systolic phase where wave phenomena are predominant. We believe that this model may serve as a basis for model-based signal processing methods for pressure estimation from non-invasive measurements and interpretation of the characteristics of pressure waves. The explicit use in the reduced model of nonlinear wave characteristics, among which some propagation delays, seems promising. Phenomena, such that peaking and steepening, are well taken into account by the soliton description. A first attempt is done here to separate the fast wave propagation phenomena taking place in a boundary layer in time and space described by a KdV equation from the slow windkessel effect represented by a parabolic equation leading to windkessel models. It relies on the hypothesis that radial and axial acceleration terms are small. A heuristic multiscale singular perturbation technique is used to derive the model. Giving more solid basis to this technique will be the topics of further research. It is already possible to observe that 2-soliton descriptions of the waves combined with two-element windkessel models active outside a boundary layer, in the diastolic phase, lead to good experimental results to represent pressure pulse waves. The close form formulae of these nonlinear models of propagation in conjunction with windkessel models are rather easy to use to represent wave shapes at the input and output of an arterial compartment. Some very promising preliminary comparisons of numerical results obtained along this line with real pressure data have been shown.

The soliton decomposition leads already to a good approximation of the pressure pulse using only forward waves (and windkessel flow). To improve this approximation introducing reflected waves (still solitons here) will probably be useful. This will be the object of future works along with clinical interpretation of all the wave parameters.

## VI. ACKNOWLEDGMENTS

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