



# The properties of Van der Pol - Duffing hemodynamics mathematical model for the clinical applications

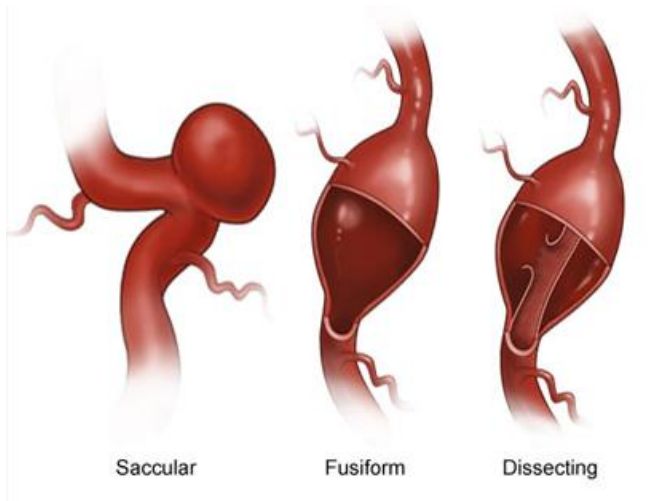
Cherevko A.A., Parshin D.V., Chupakhin A.P.

Novosibirsk - 2018

# Outline

- Introduction
- Clinical measurements
- Mathematical model
- Results
- Conclusions
- References

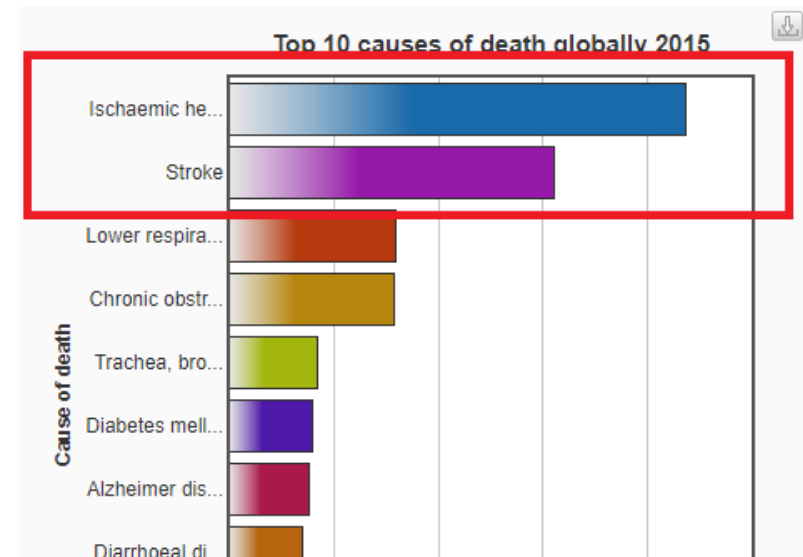
# Introduction. Cerebral aneurysms



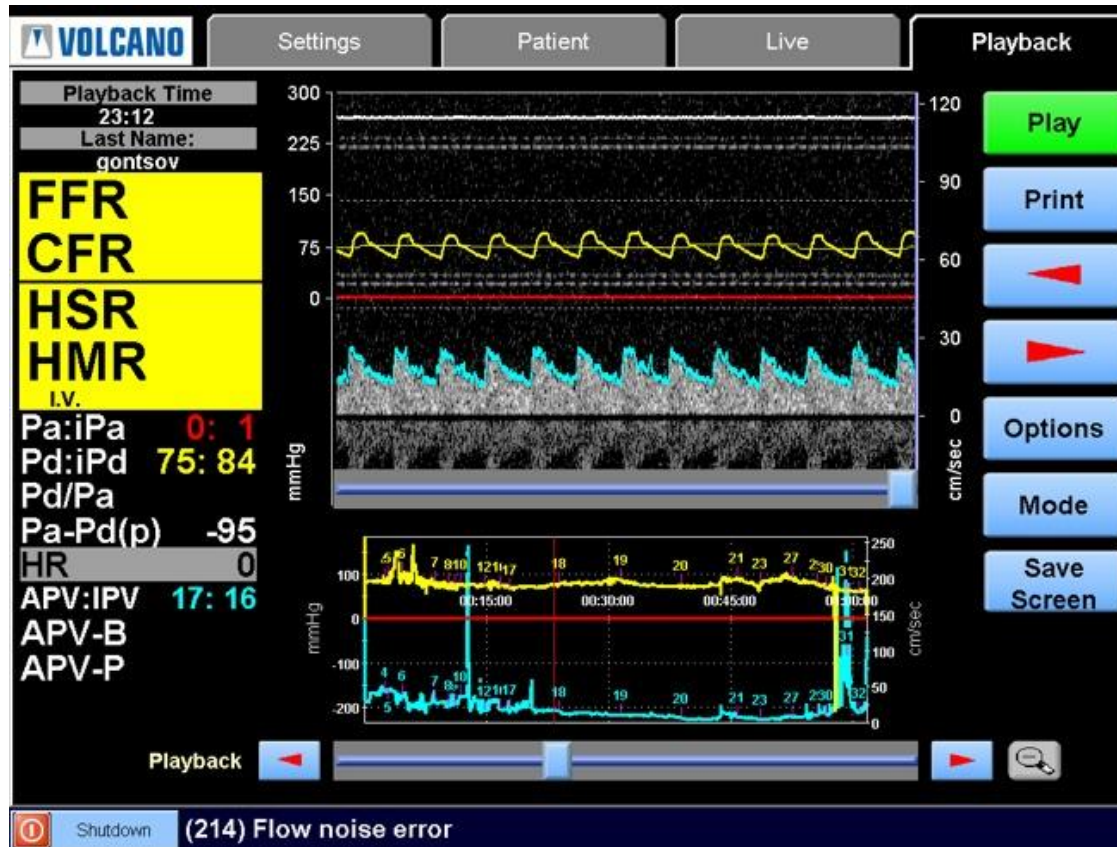
Cerebral aneurysm varieties

- Each one of 50 people has cerebral aneurysm. Multiple aneurysms are also widespread.

- In **top-10** death cause diseases WHO (January 2017)

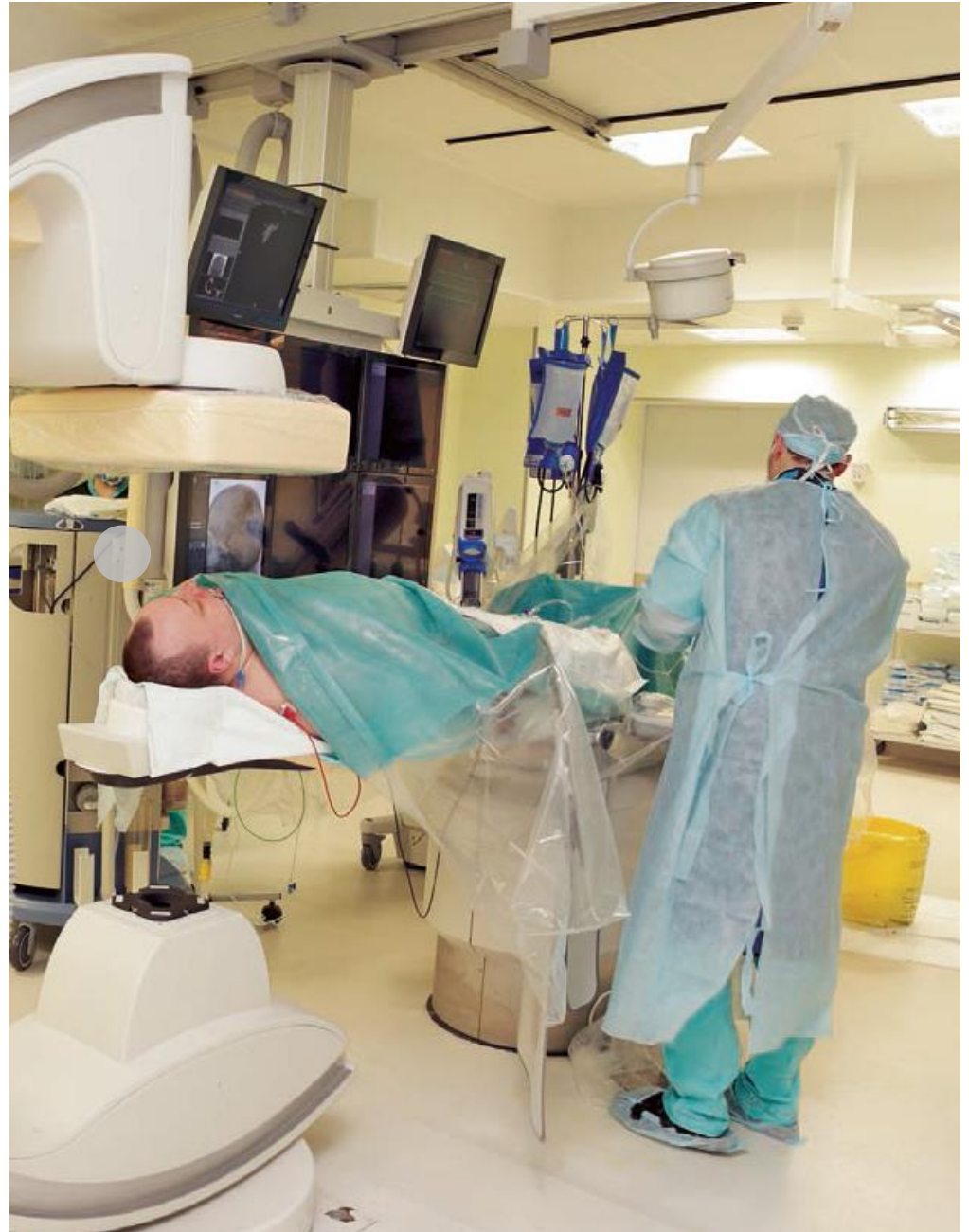
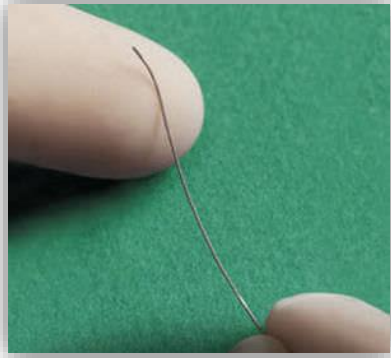


# Clinical measurements



Measurements performed via Combo Map© unit and Combo Wire© sensor.

# During the treatment



# Pressure – Velocity investigation of cerebral circulation

Blood flow pressure and velocity can be presented like a combination of “fast” and “slow” variables:

$$p(t) = p_{ave}(t) + a_p(t) q(t)$$

$$v(t) = v_{ave}(t) + a_v(t) u(t)$$

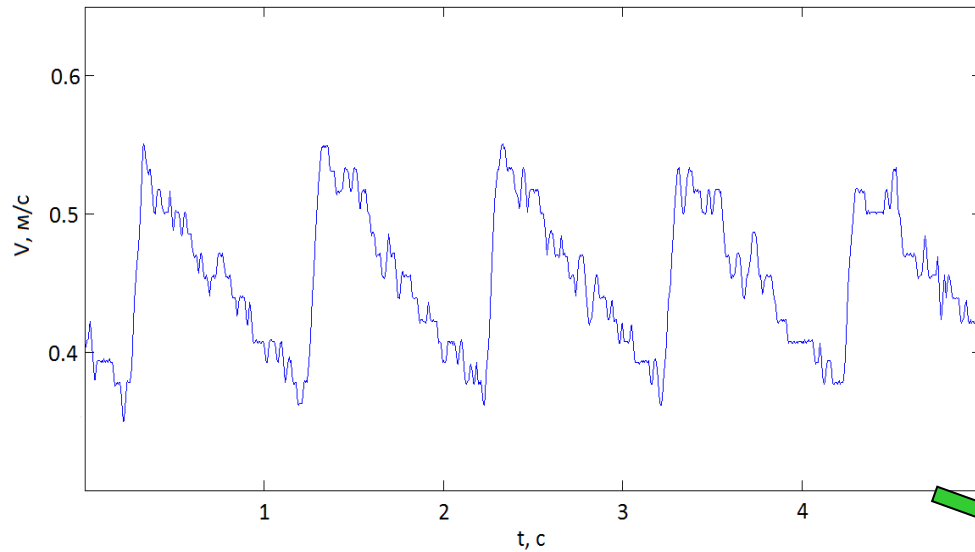
Slow variables

Fast variables

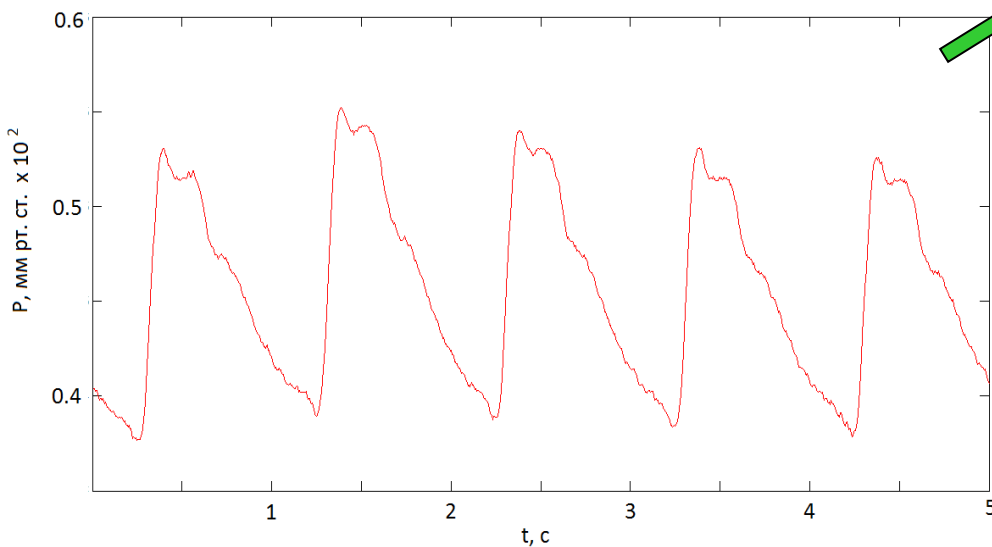
**Physiological interpretation:** The reaction of muscles on a pulse wave is local – the signal goes from the blood flow, not controlled by CNS and conducting at the place.

# Clinical data

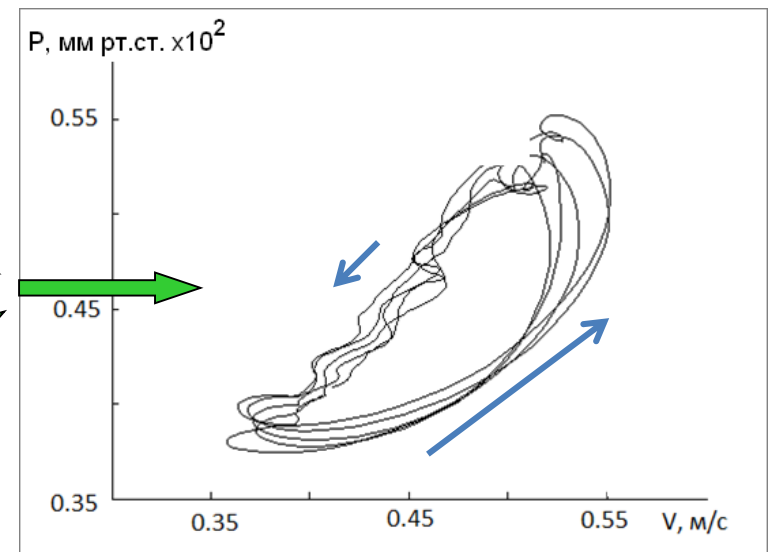
Velocity, m/s



Pressure, mm.Hg.\*100



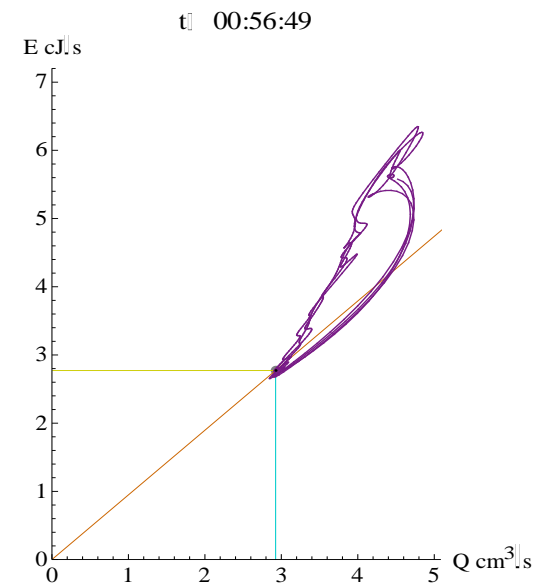
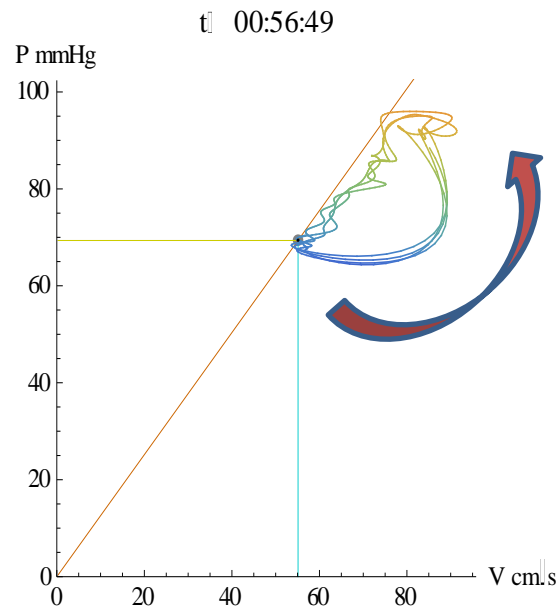
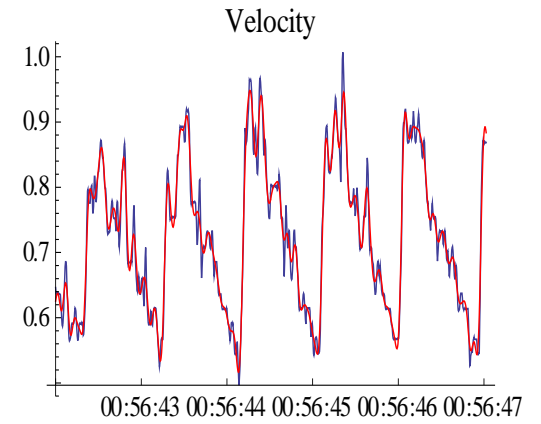
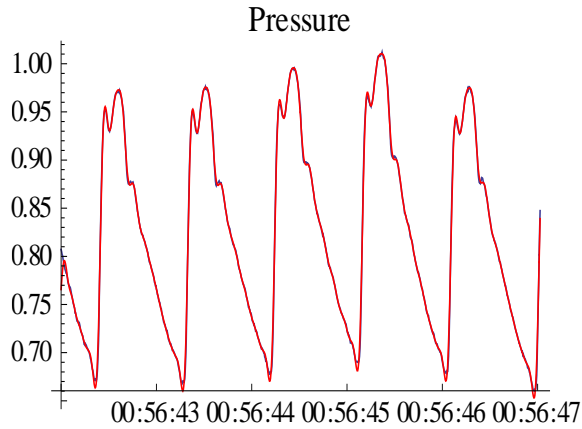
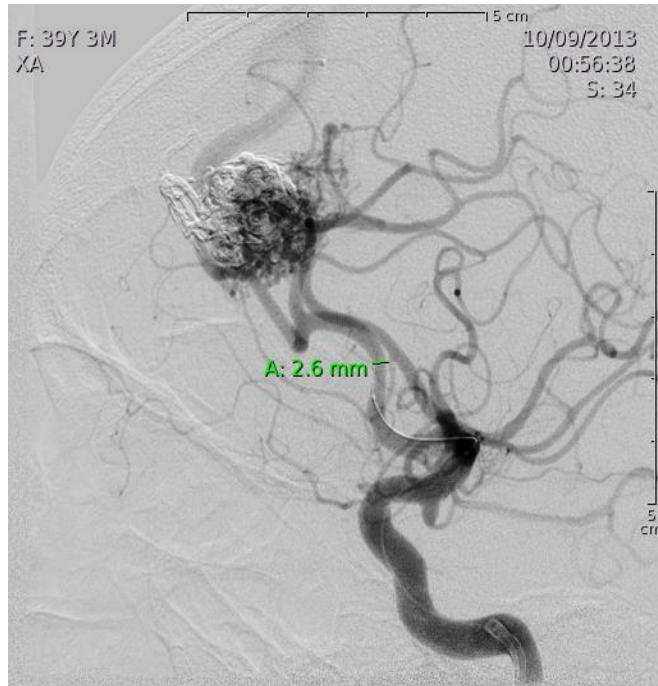
**Slow variables define  
the shape of VP-diagrams**



V,P-diagram

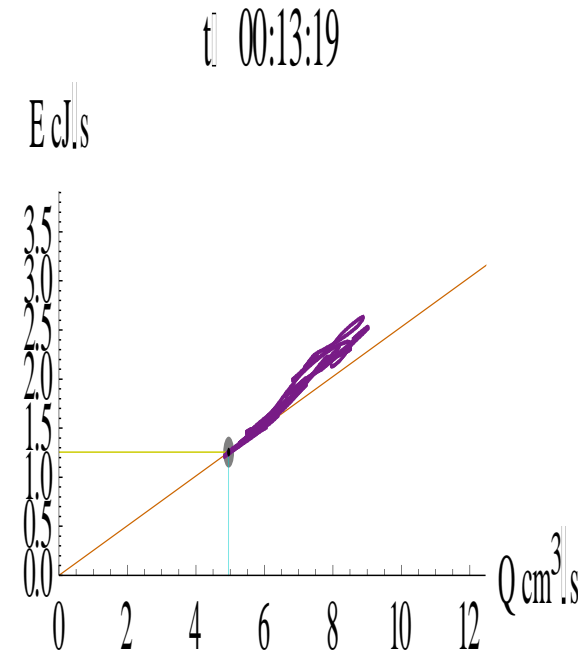
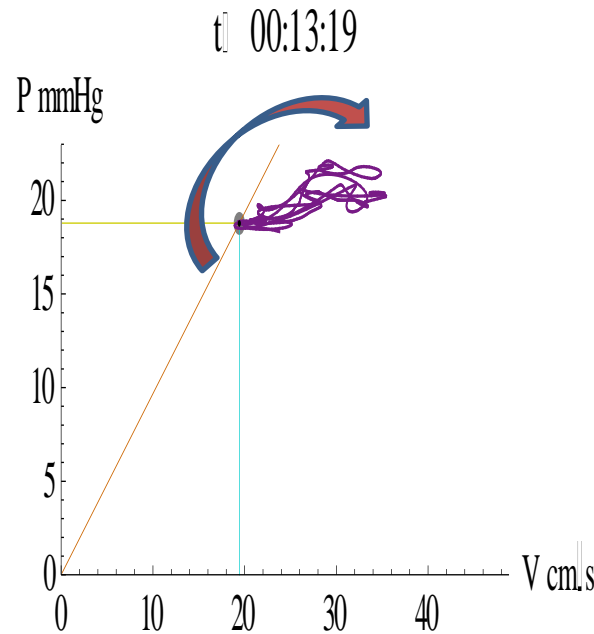
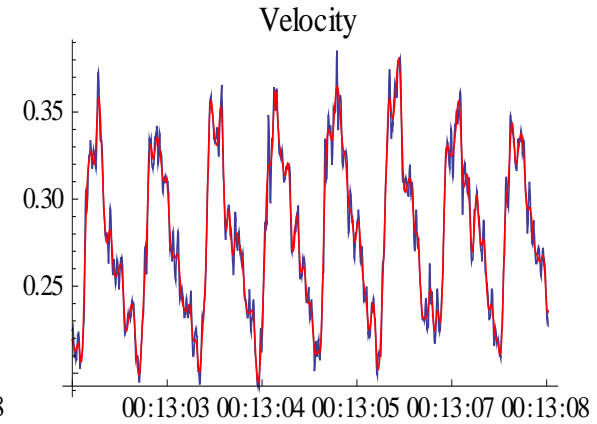
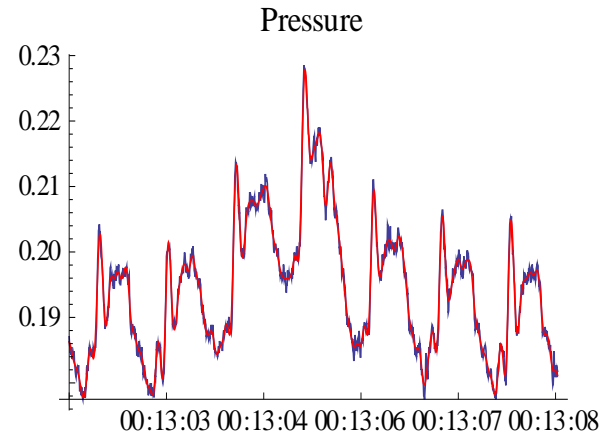
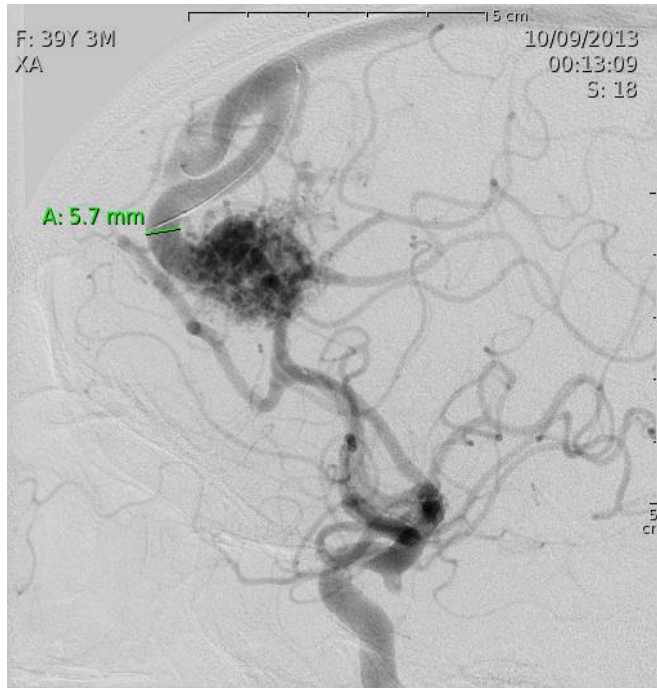


# Inside an artery





# Inside a vien



# Phenomenological mathematical models of cerebral circulation

Austin G, 1971  $v'' + Av - Bv^2 + Cv^3 = RHS(p)$

Cronin J, 1973  $v'' + Av - Bv^2 + Cv^3 = RHS(p)$

Austin G, 1974  $v'' + Av' + Bv + Cv^2 = RHS(p)$

Cronin J, 1974  $v'' + Av' + B = RHS(p)$

↓ Nieto, 2000  $v'' + Av' - Bv^2 + Cv^3 = RHS(p)$

# Generalized Van der Pol – Duffing equation

- Allow to define a character of fast hemodynamical parameters near with a pathology:

$$\varepsilon q'' + (a_1 + a_2 q + a_3 q^2) q' + b_1 q + b_2 q^2 + b_3 q^3 = k u,$$

$$a_i, b_i, k \in R; \quad i = 1, 2, 3;$$

- here  $u$  is the velocity,  $q$  is the pressure. For the arterial compartment velocity is defined by a clinical data and manage the pressure values which can be found from the equation.
- Coefficients  $a_i, b_i, k$  fit by inverse problem methods on the clinical data. Coefficients  $b_i$  are responsible for the elastic properties of a vessel and  $a_i$  are responsible for the damping,  $\varepsilon$  corresponds to a relaxation oscillations in the system.

# The existence of the solution

Let us consider an equation:  $\varepsilon x'' + f(x)x' + g(x) = e(t)$ ,  
(2)

The equivalent system(3) takes a form:

$$\begin{cases} x' = -F(x) + v \\ v' = -g(x) + e(t) \end{cases}, \quad (3)$$

where  $f(x)$ ,  $g(x)$  –are continuous for all  $x$ ,  $F(x) = \int_0^x f(s)ds$ ,

$e(t)$  – periodical function with period  $\theta$ . Hence the conditions of Poincaré theorem are satisfied<sup>1</sup>.

# Normalization of a clinical data

$$p, v \longrightarrow q, u$$

For the interval  $I_5$  the pressure and the velocity could be made dimensionless by the formulas :

$$q = \frac{p_{I_5} - \xi}{\max_{I_5} |p_{I_5} - \xi|}, \quad u = \frac{v_{I_5} - \eta}{\max_{I_5} |v_{I_5} - \eta|}.$$

With respect to the method of such procedure,  $\xi$  and  $\eta$  take the values:

- $\xi = \overline{p_{I_5}}, \eta = \overline{v_{I_5}}$  - average integral values for  $p_{I_5}, v_{I_5}$  respectively
- $\xi = \frac{\min p_{I_5} + \max p_{I_5}}{2}, \eta = \frac{\min v_{I_5} + \max v_{I_5}}{2}$

# Discretization of the equation

We use discrete analogue of differential equation (1) :

$$\begin{aligned} q(t-0) + \tilde{c}_1 q(t-\Delta t) + \tilde{c}_2 q(t-2\Delta t) + \tilde{c}_3 (q(t-\Delta t) - q(t-2\Delta t)) q(t-\Delta t)^2 + \\ + \tilde{c}_4 q(t-\Delta t)^2 + \tilde{c}_5 (q(t-\Delta t) - q(t-2\Delta t)) q(t-\Delta t)^2 + \tilde{c}_6 q(t-\Delta t)^3 = \tilde{c}_7 u(t-\Delta t), \end{aligned} \quad (7)$$

Here  $\Delta t = \frac{1}{m}$  – is a time step.

To calculate 7 parameters values we use 1000 points from the experiment (5-second time interval). Hence we deal with an overdefined system (1000x7 matrix). To find out the coefficients of the equation we used Matlab System Identification Toolbox.

# Coefficients identification

Let  $q \in R^n$ ,  $f \in R^m$ ,  $A$  – a matrix of  $m \times n$  size.

**“Pseudo” solution** of a system

$$Aq = f \quad (8)$$

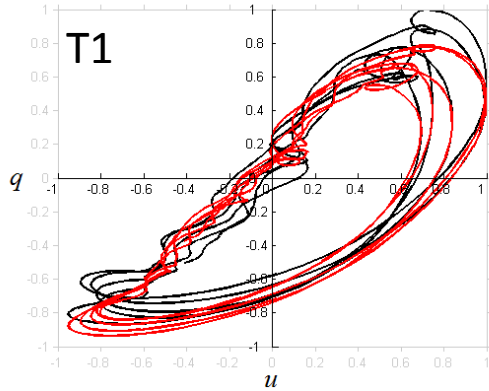
is a vector  $q_{\Pi} \in R^n$ , which minimize the norm of the discrepancy

$$J(q) = \|Aq - f\|^2 \rightarrow \min .$$

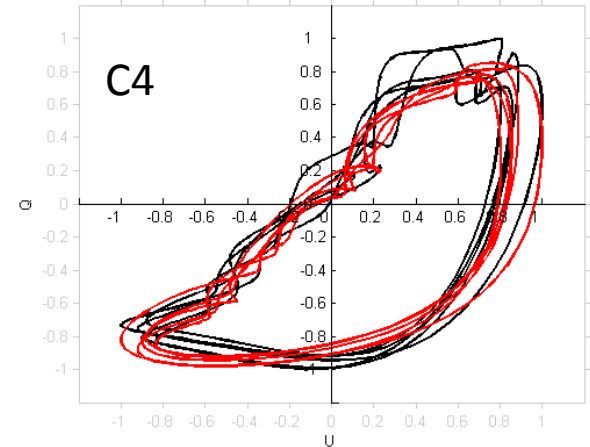
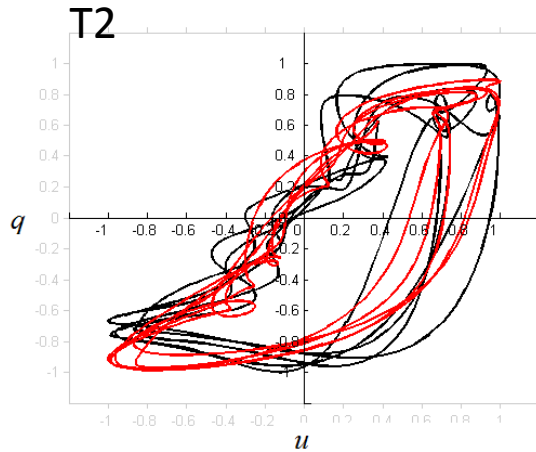
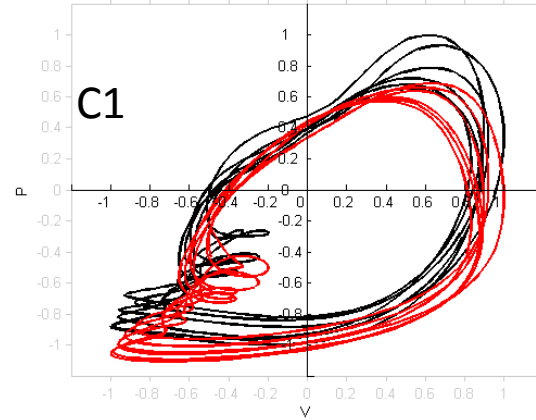
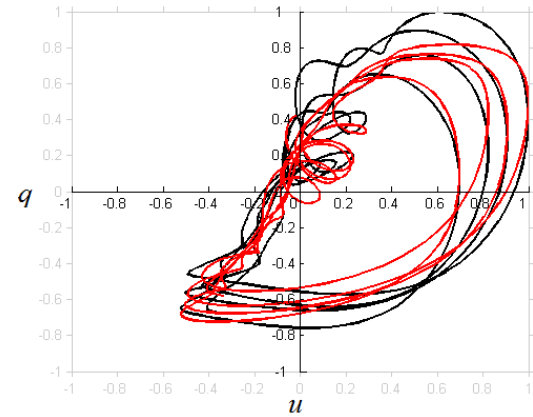
System (8) has no a classical solution due to it's overdifinition.



# Q,U diagrams (results for 5 patients)

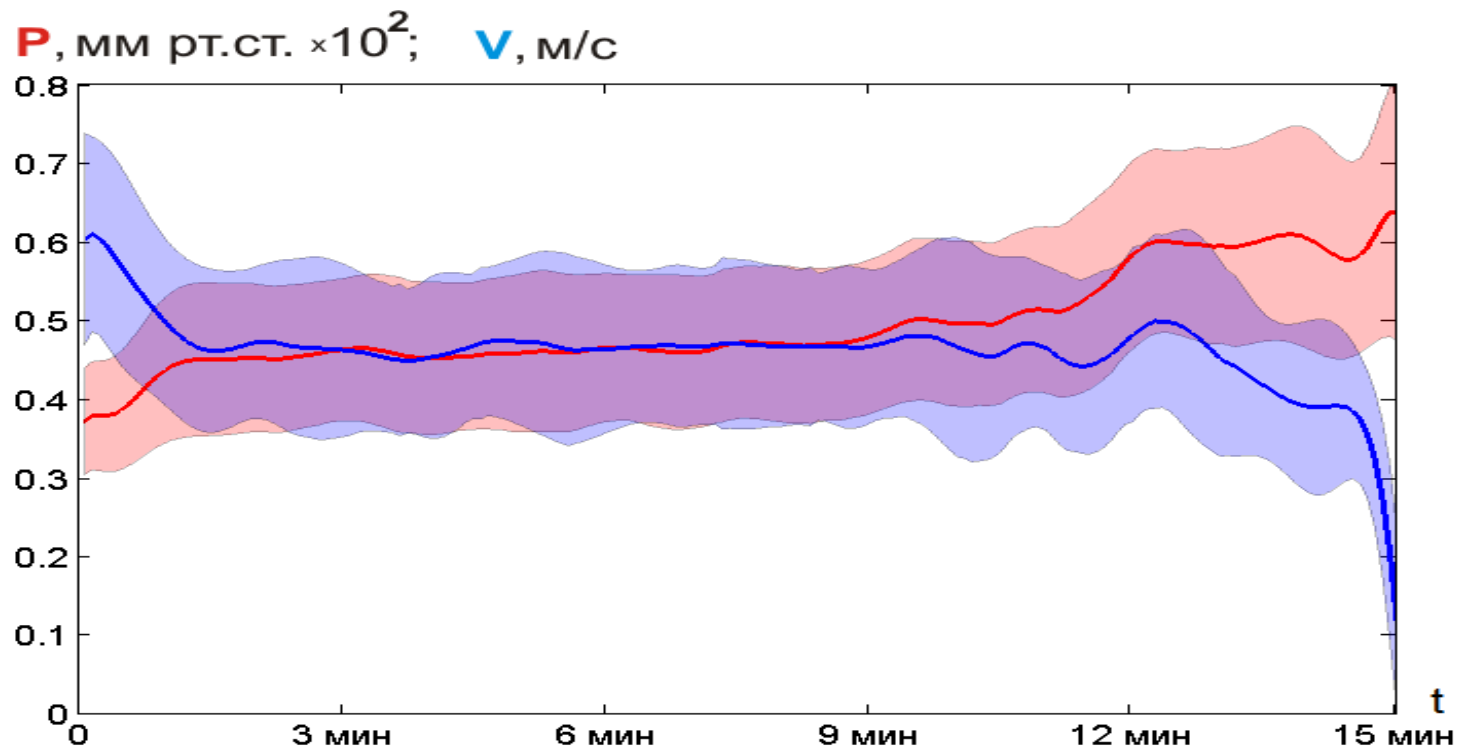


Sh1



qu-diagrams

The model constructed by 5 sec time interval has a good prediction up to 10 minutes.



# Analysis of the system via harmonic probing

For the further investigation we used a method of harmonic probing. This method is widely spread in medicine and enterprise technology:



Harmonic probing – is a base of any kind of Ultra sound diagnostic.

This technique is commonly adopted for the testing of complex mechanical systems.



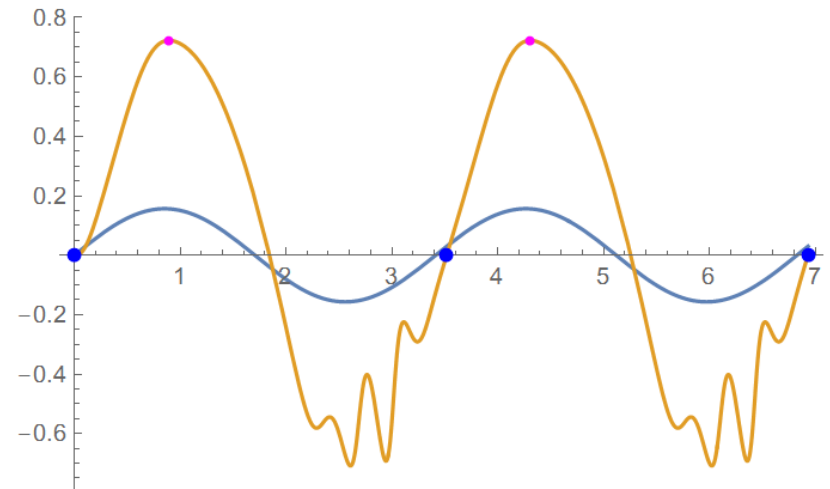
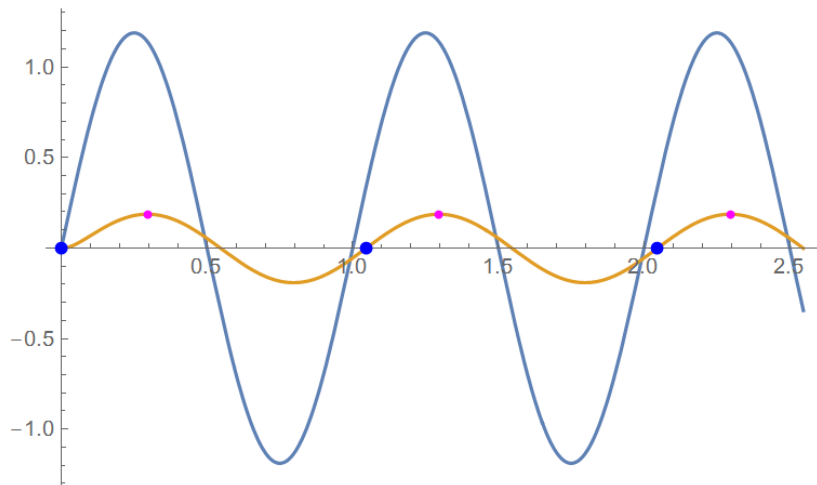
# Probing of the system by harmonic signal

$$\varepsilon q'' + (a_1 + a_2 q + a_3 q^2) q' + b_1 q + b_2 q^2 + b_3 q^3 = k B \sin(\omega t)$$

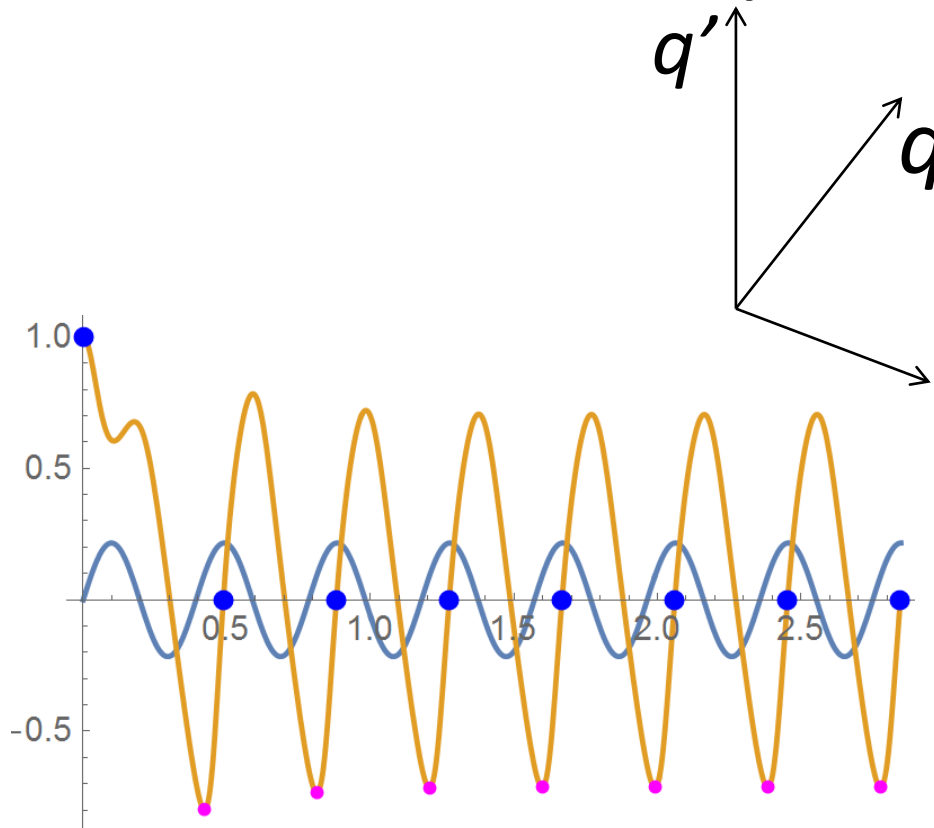
## Hypothesis

«Healthy» vessels → «simple» dynamics

«Sick» vessels → «complex» dynamics

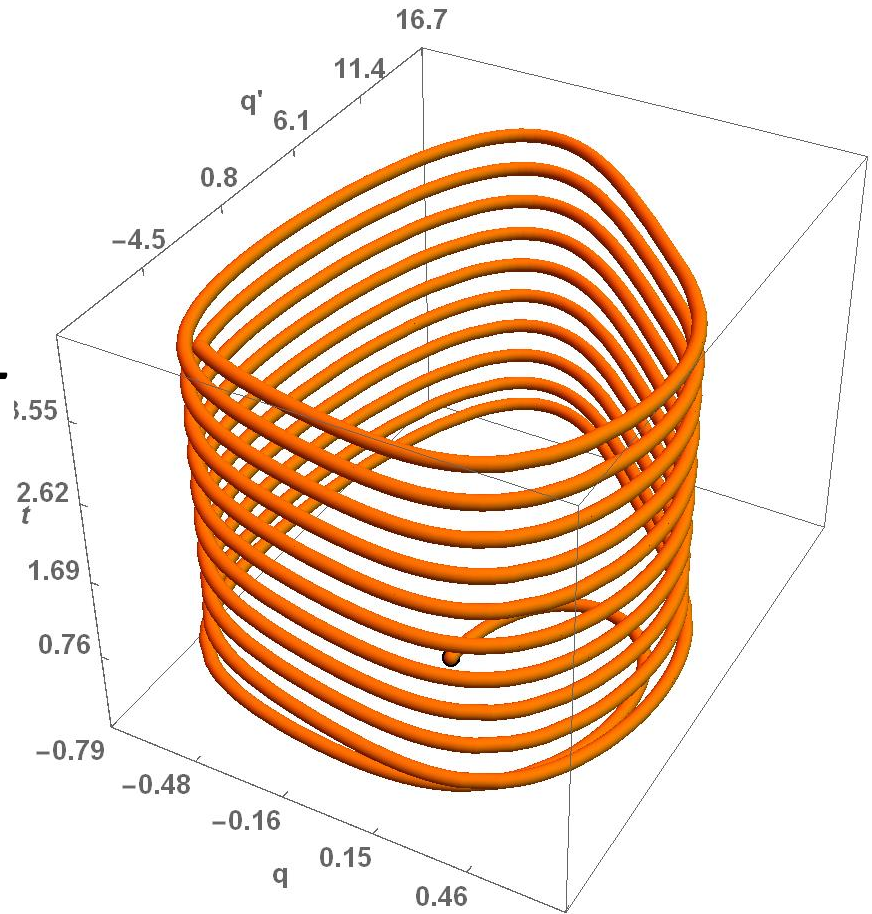


The behavior of the solution when right hand side of equation (1) is harmonic



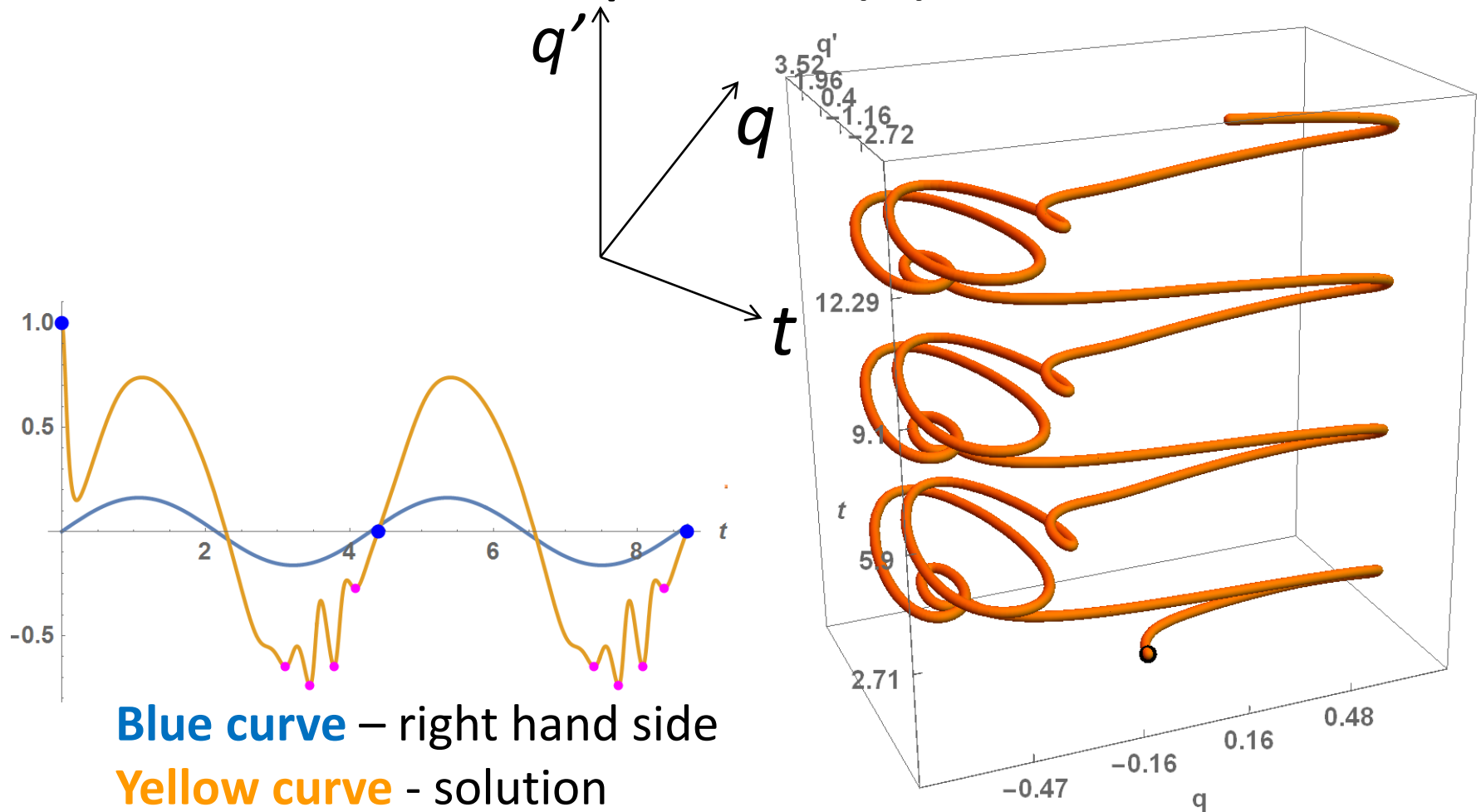
**Blue curve** – Right hand side

**Yellow curve** - solution



Integral curve in an expanded  
phase space

The behavior of the solution when right hand side of equation (1) is harmonic

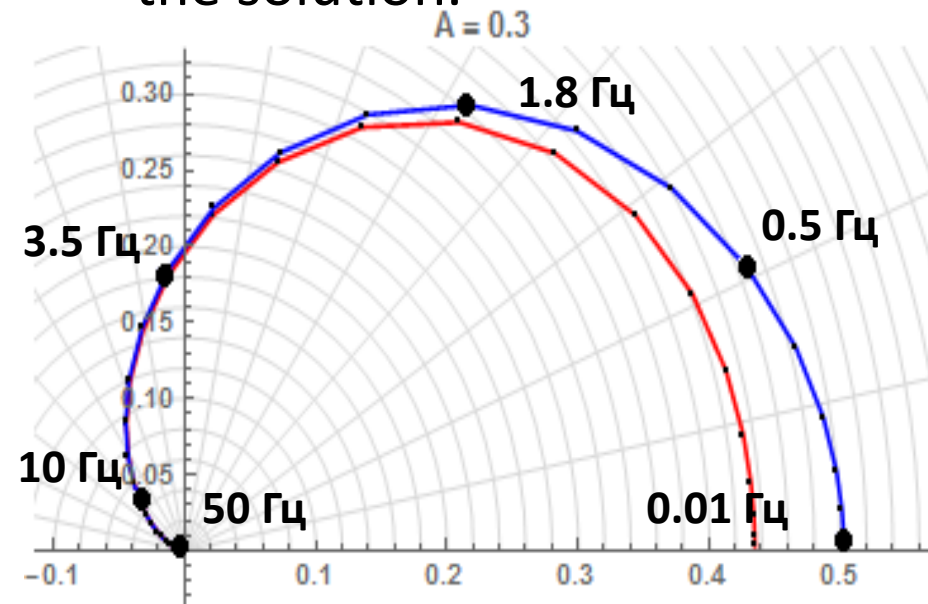


Integral curve in an expanded phase space

# Approach 1. Nyquist plot(NP)

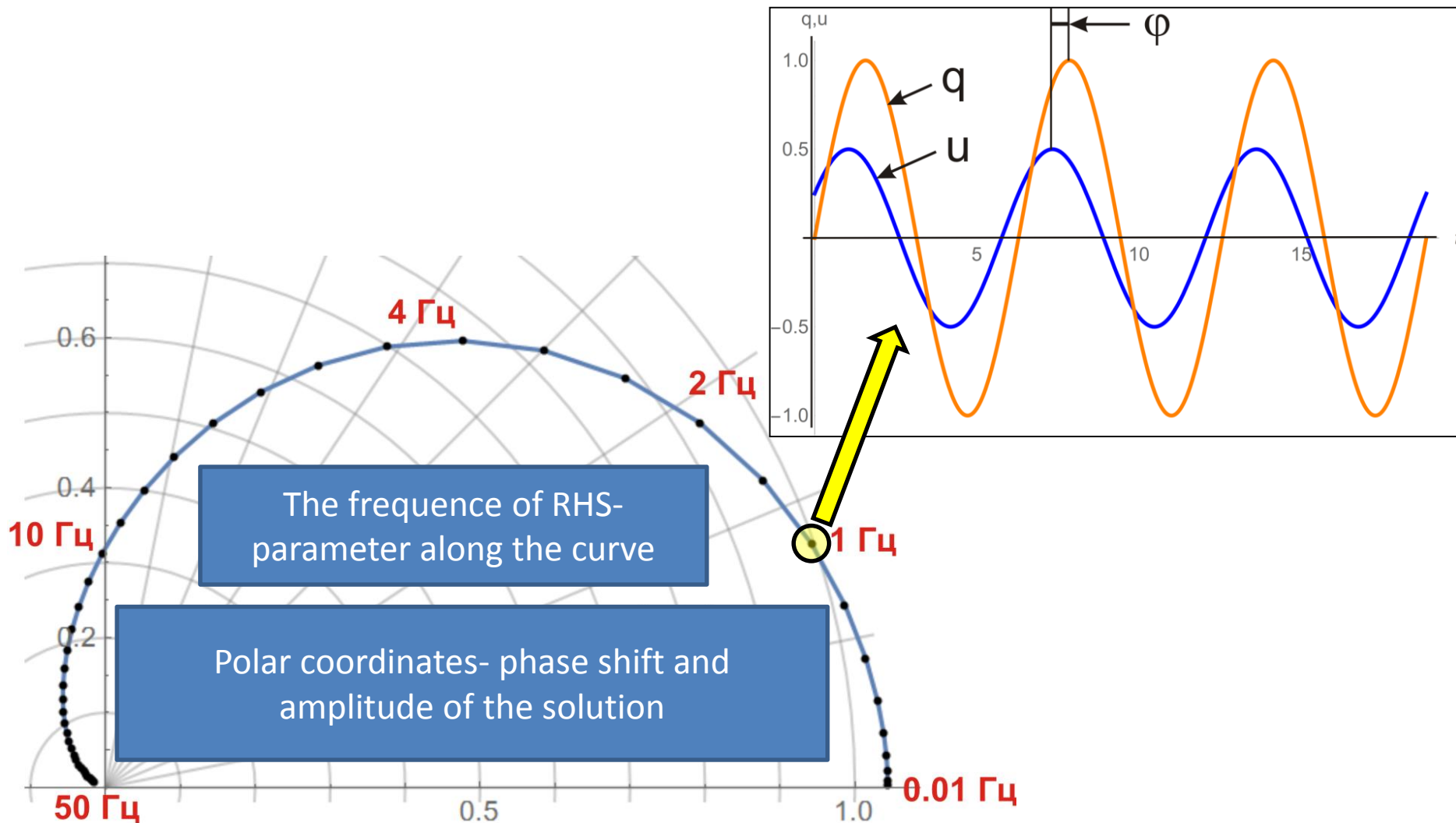
- Nonlinear generalization of Nyquist plot is used for the analysis of the how the amplitude and the frequency of RHS affect on the solution,
- Amplitude  $u$  is fixed while diagram is plotting. Frequency of RHS – parameter along the curve.
- Polar coordinates – dimensionless phase shift respectively RHS of the equation and the amplitude of the solution.

- For the nonlinear case maximum and minimum of the solution can be distinct. Blue line– absolute value of the minimum of the solution, red one – absolute value of the maximum of the solution.

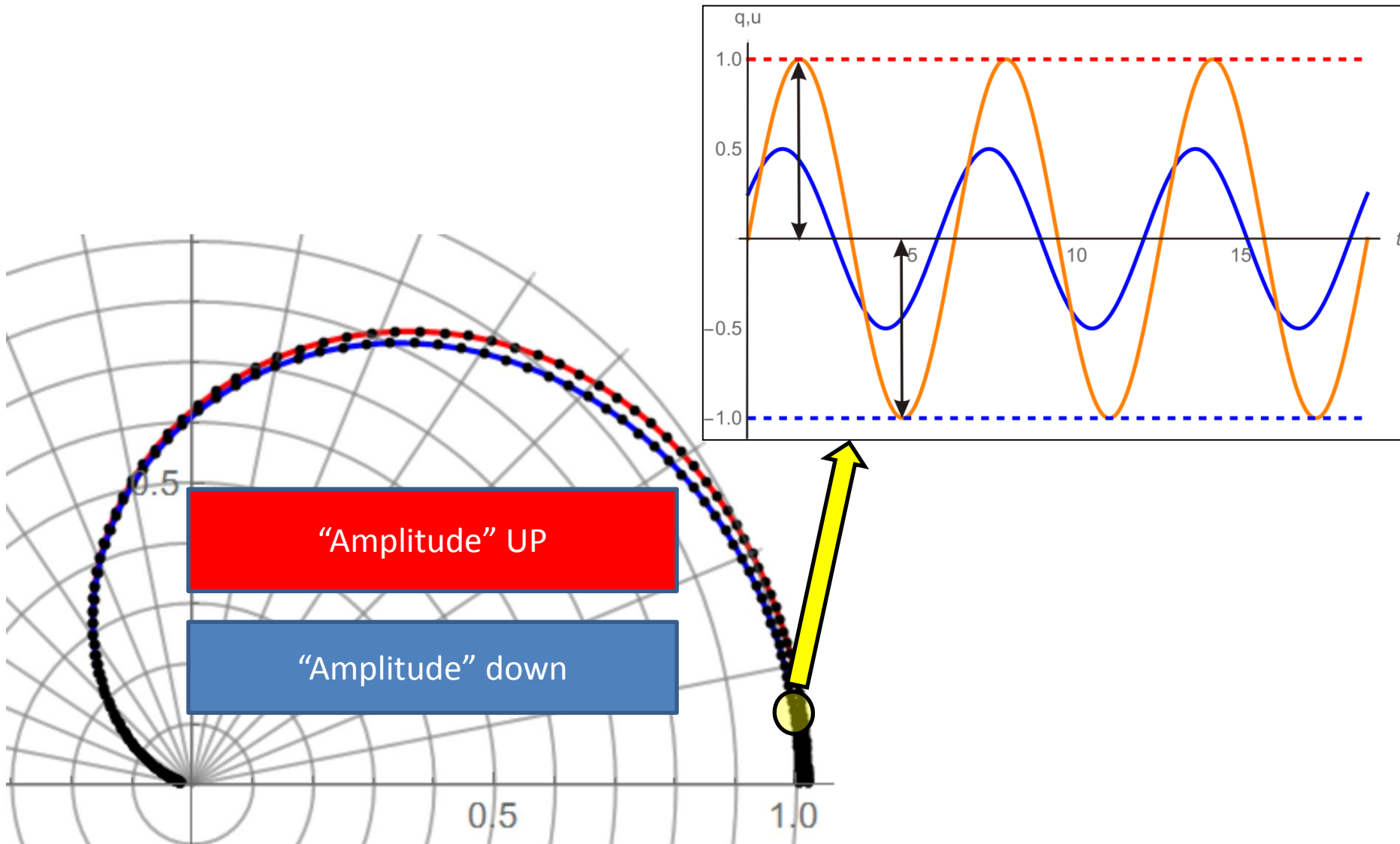




# Amplitude-phase-frequency characteristics



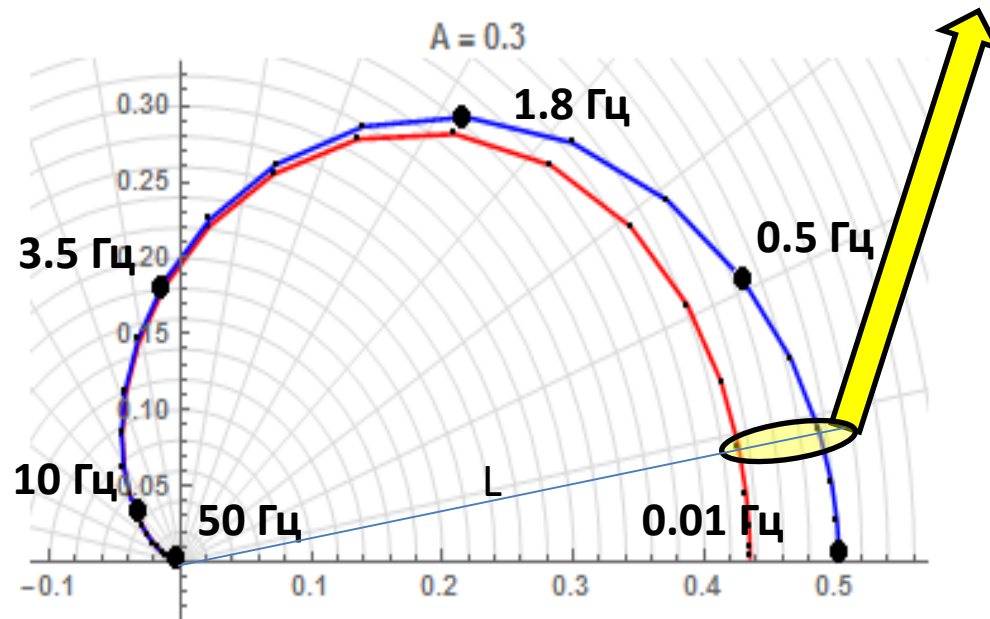
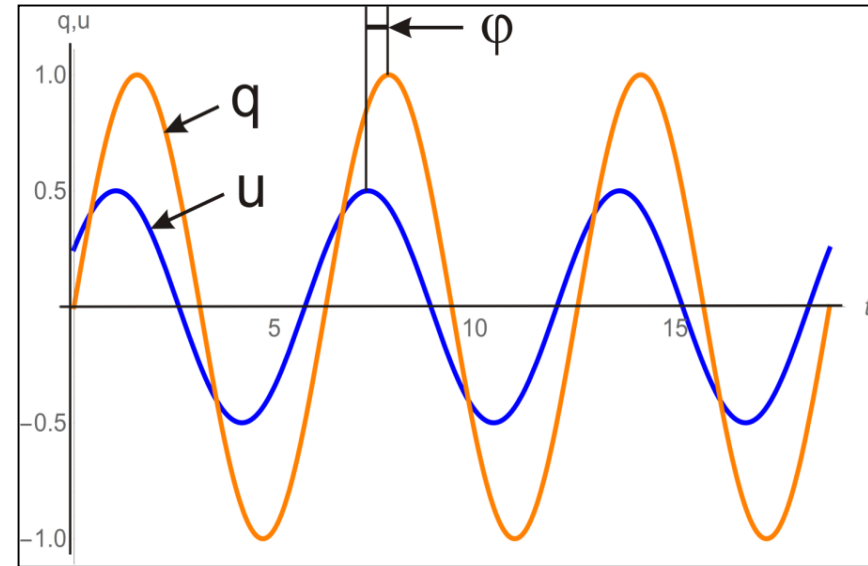
# Amplitude-phase-frequency characteristics



# Nyquist plot

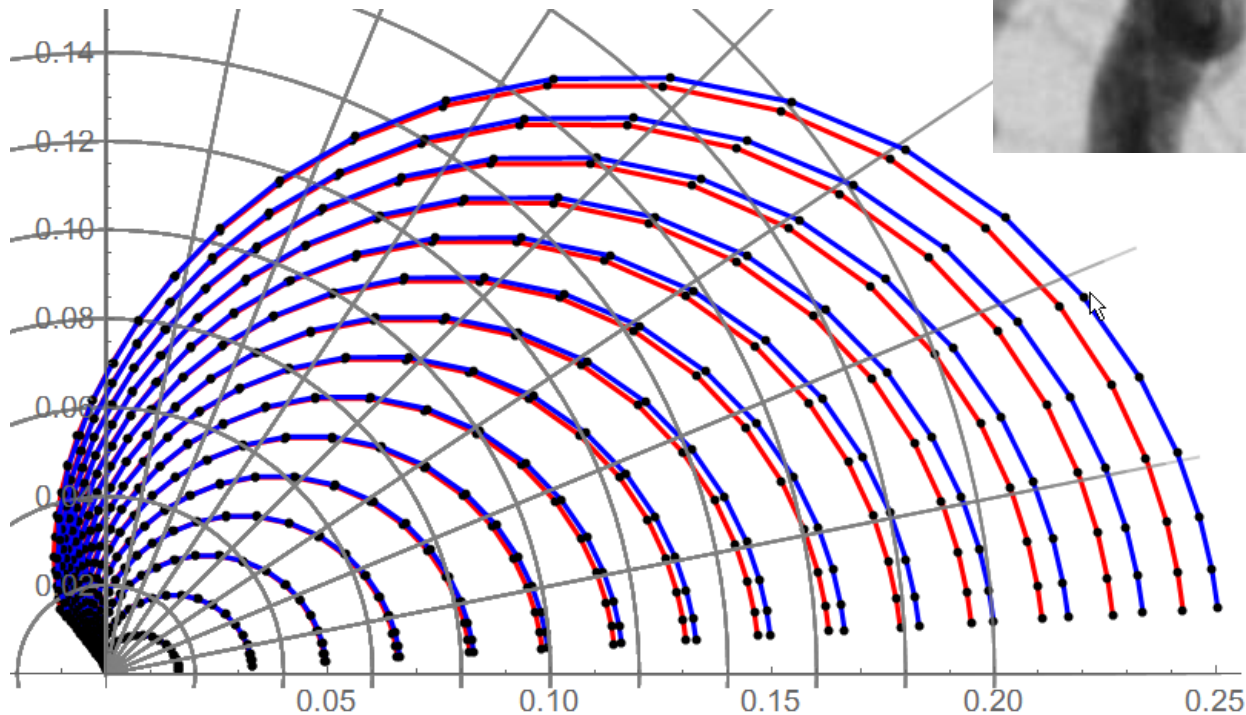
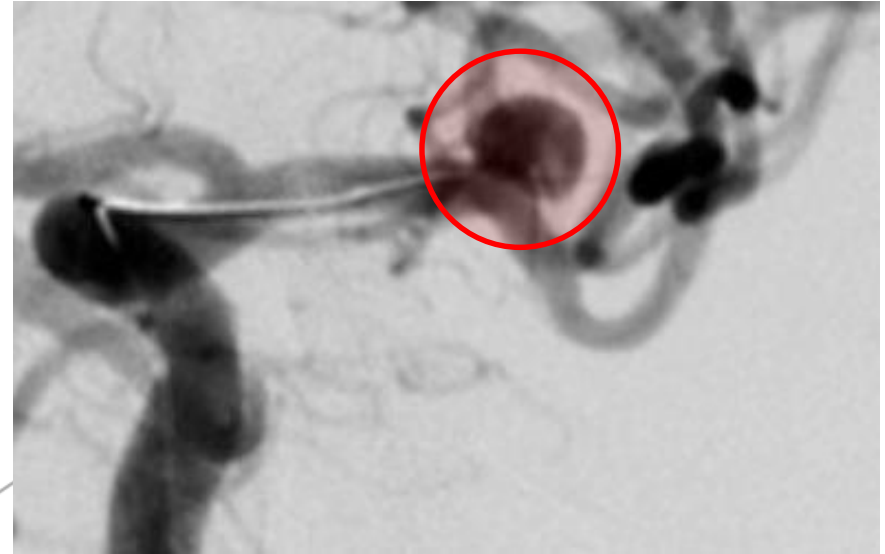
For each pair of points L1 and L2 there is a correspondence of a solution and right hand side of equation (1).

Solution plot (yellow) and right hand side of Eq.(1) plot (blue).

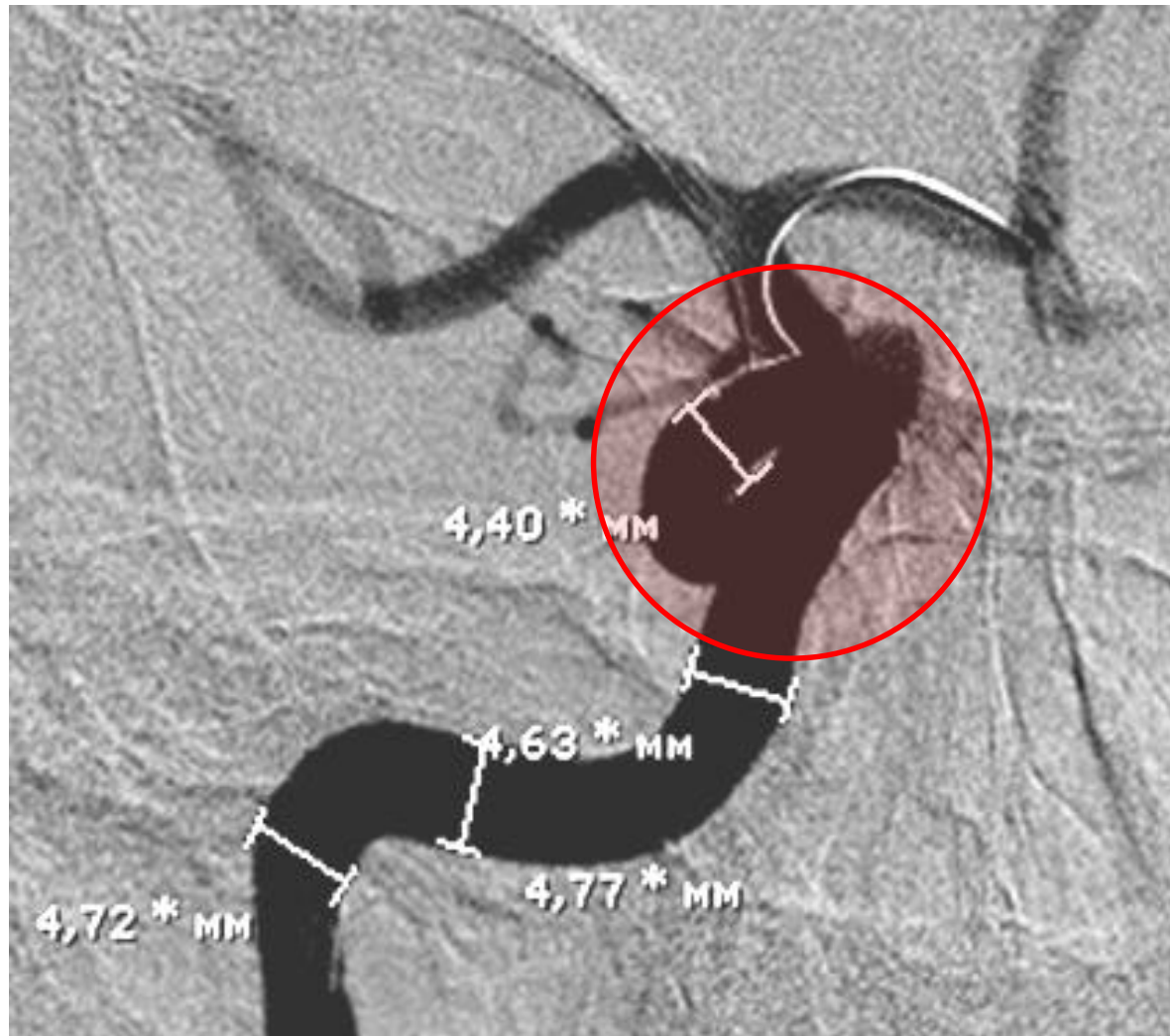


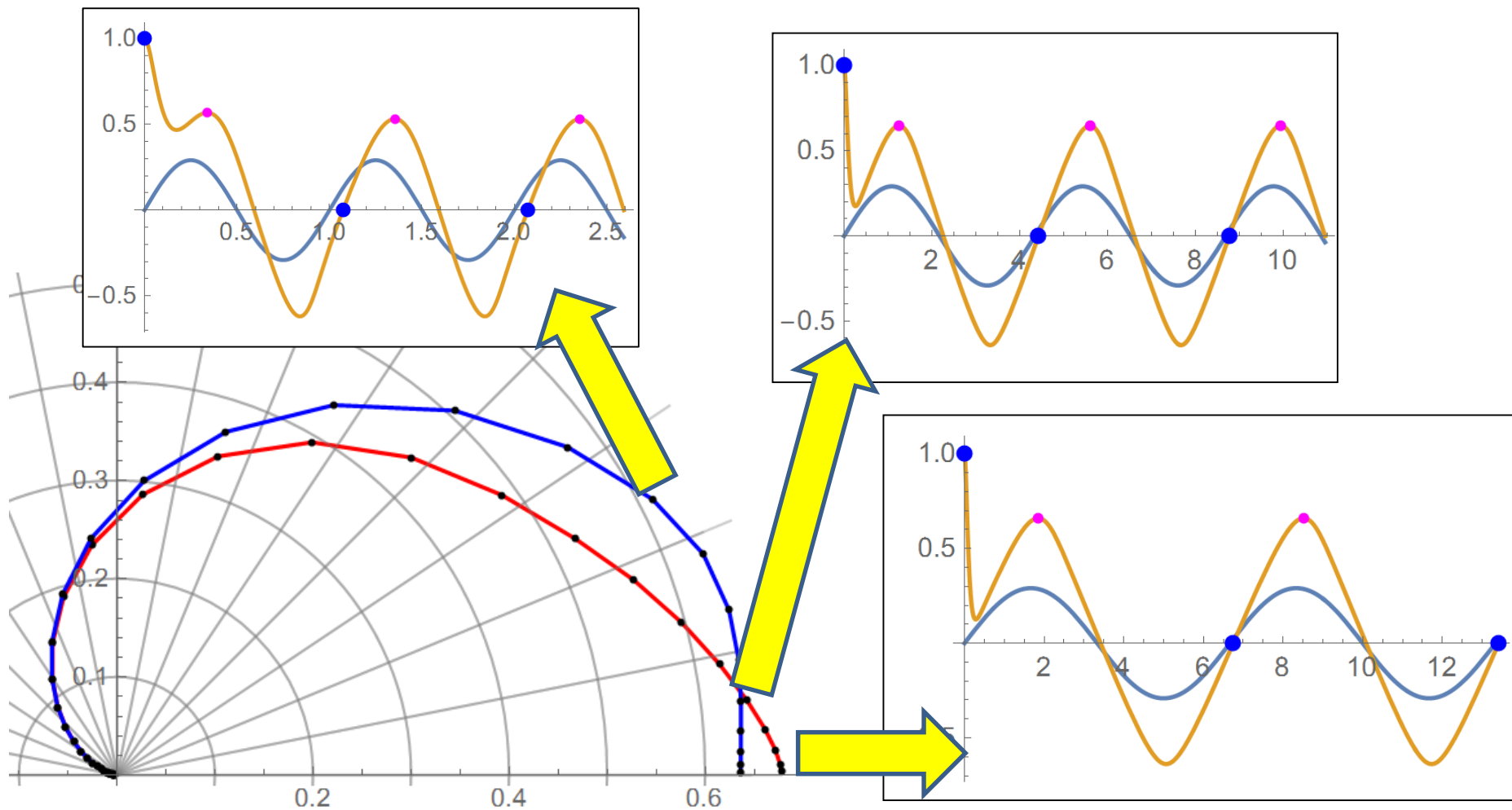
# Patient P1 has «almost linear» behavior

When an aneurysm has a small neck –this aneurysm doesn't affect substantially on the circulation.



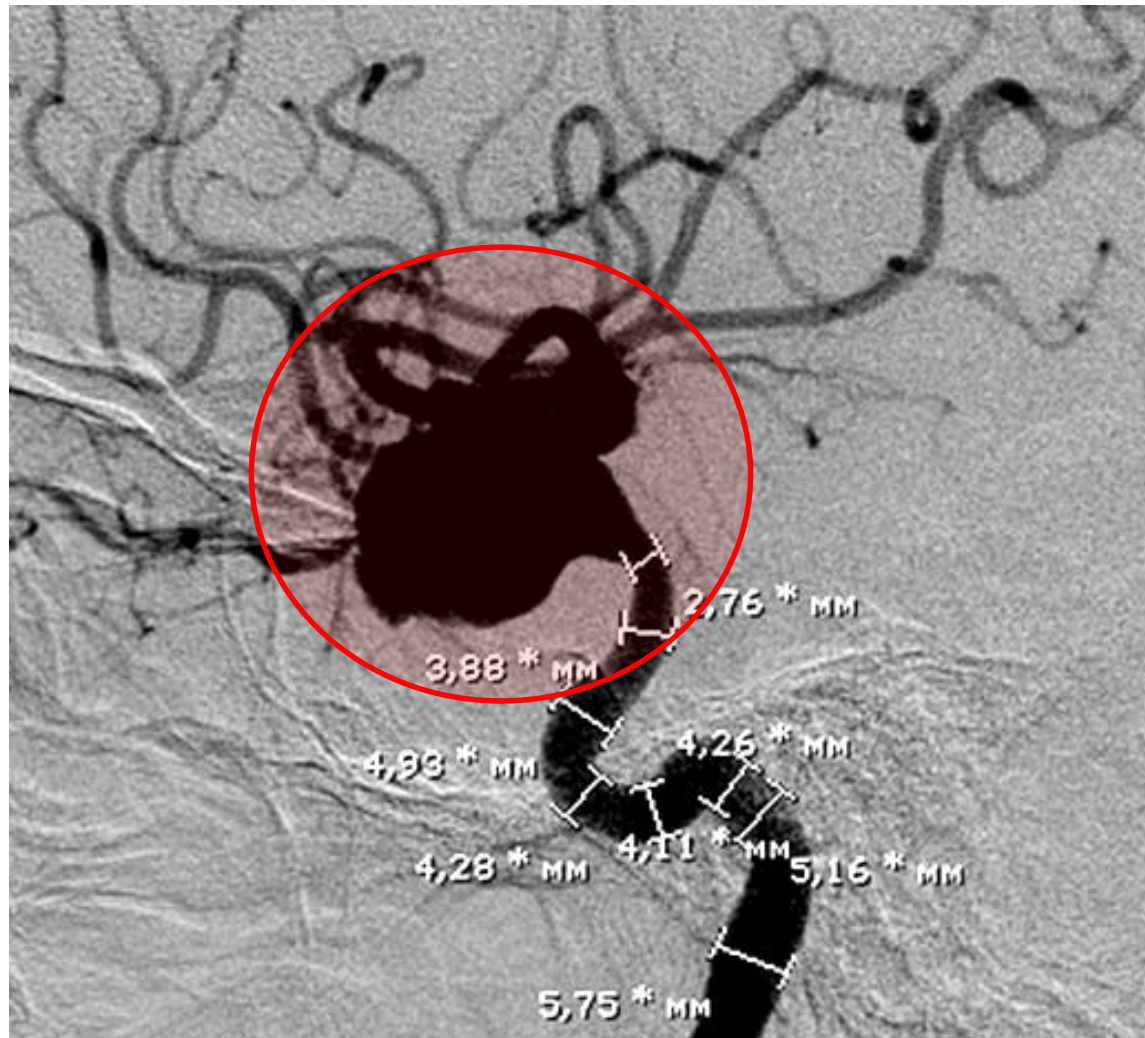
# Patient G1 – normal aneurysm of the right internal carotid artery (ICA)



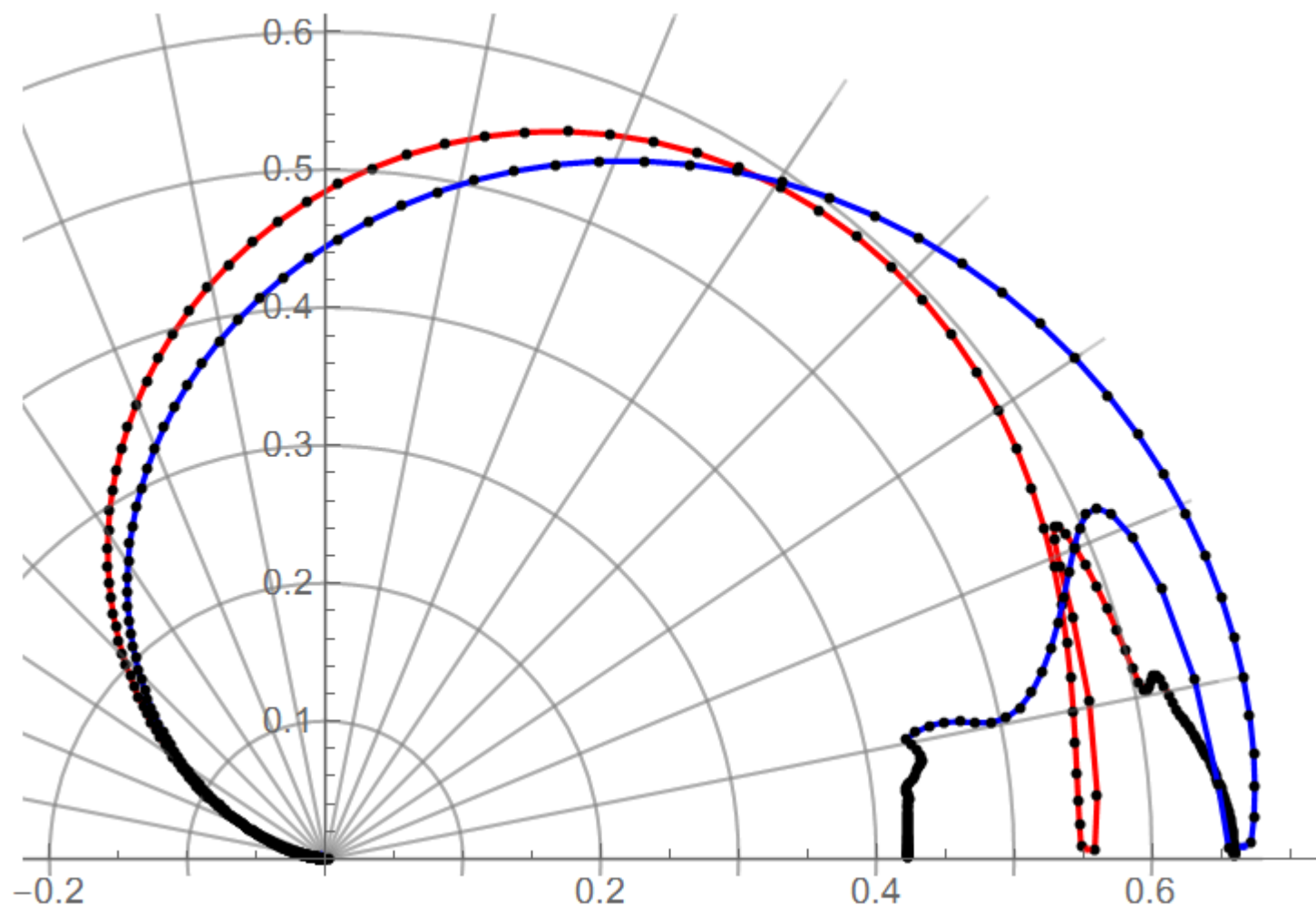


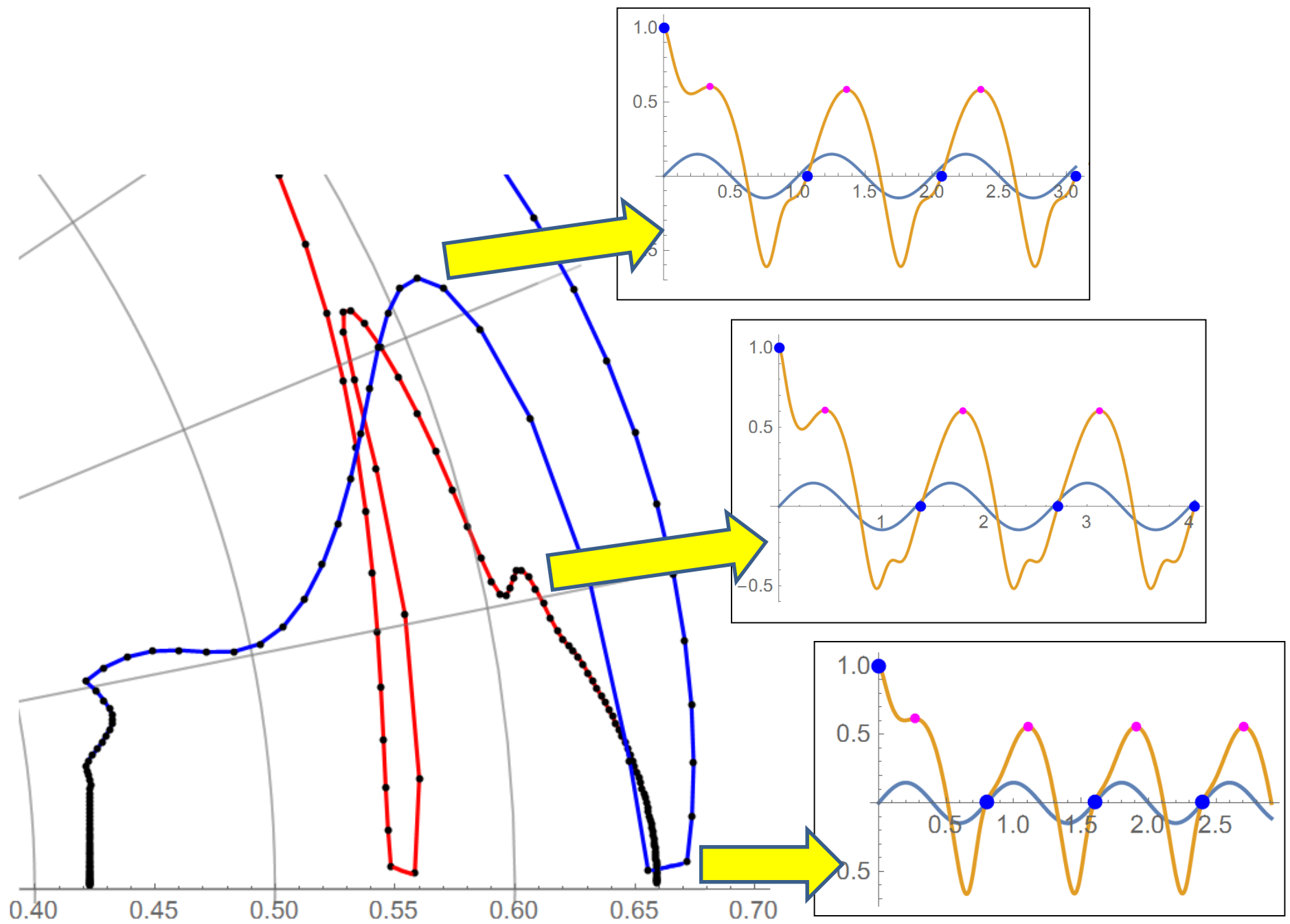


# Patient K1 – giant aneurysm of the right ICA









## Approach 2. Stationary points.

Let us denote:  $p = \varepsilon q' / a_3^2 + a_1 q / a_3 + a_2 q^2 / a_3^2 + q^3 / 3$

$$\theta(t) = \omega t, a_3 \neq 0$$

Then the equation (1) could be represented like a system:

$$\begin{cases} p' = (b_1 q + b_2 q^2 + b_3 q^3) - 2 \sin(2\pi\theta), \\ \varepsilon q' = a_3^2 p - a_1 a_3 q - a_2 a_3 q^2 / 2 - a_3 q^3 / 3, \\ \theta' = \omega. \end{cases} \quad (2)$$

with relaxation oscillations,  
 $\varepsilon$  - is a small parameter.

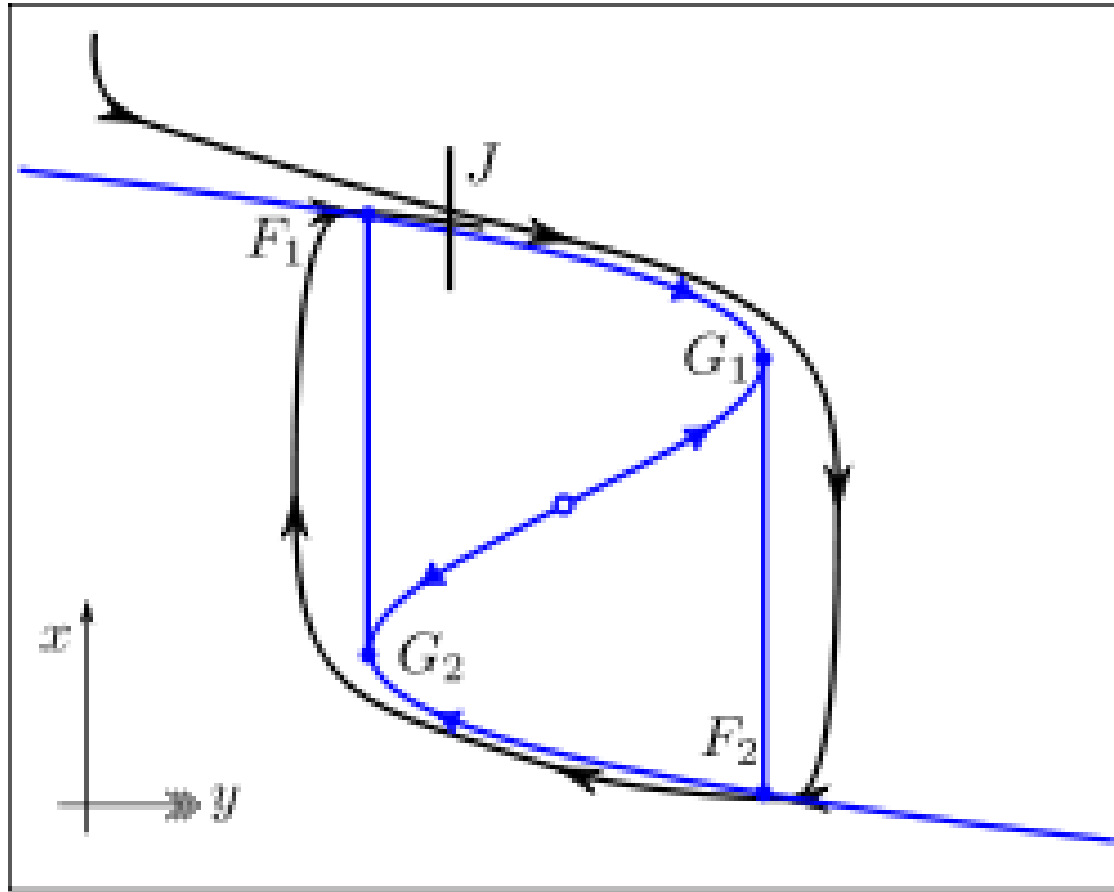
# Slow and fast subsystems

$$\begin{cases} p' = (b_1 q + b_2 q^2 + b_3 q^3) - 2 \sin(2\pi\theta), \\ \varepsilon q' = a_3^2 p - a_1 a_3 q - a_2 a_3 q^2 / 2 - a_3 q^3 / 3, \\ \theta' = \omega. \end{cases}$$

Slow subsystem

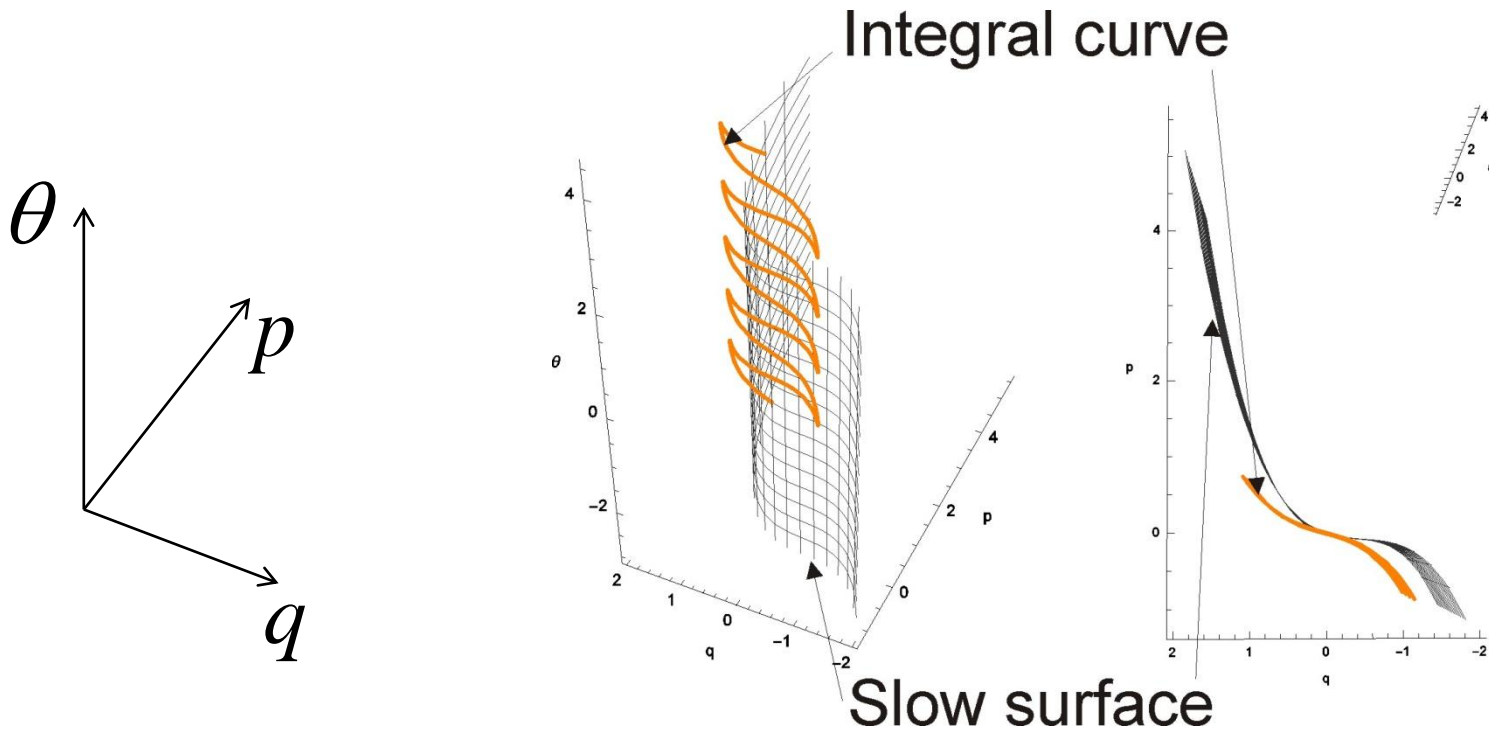
Fast subsystem

# Physical interpretation of slow and fast movements



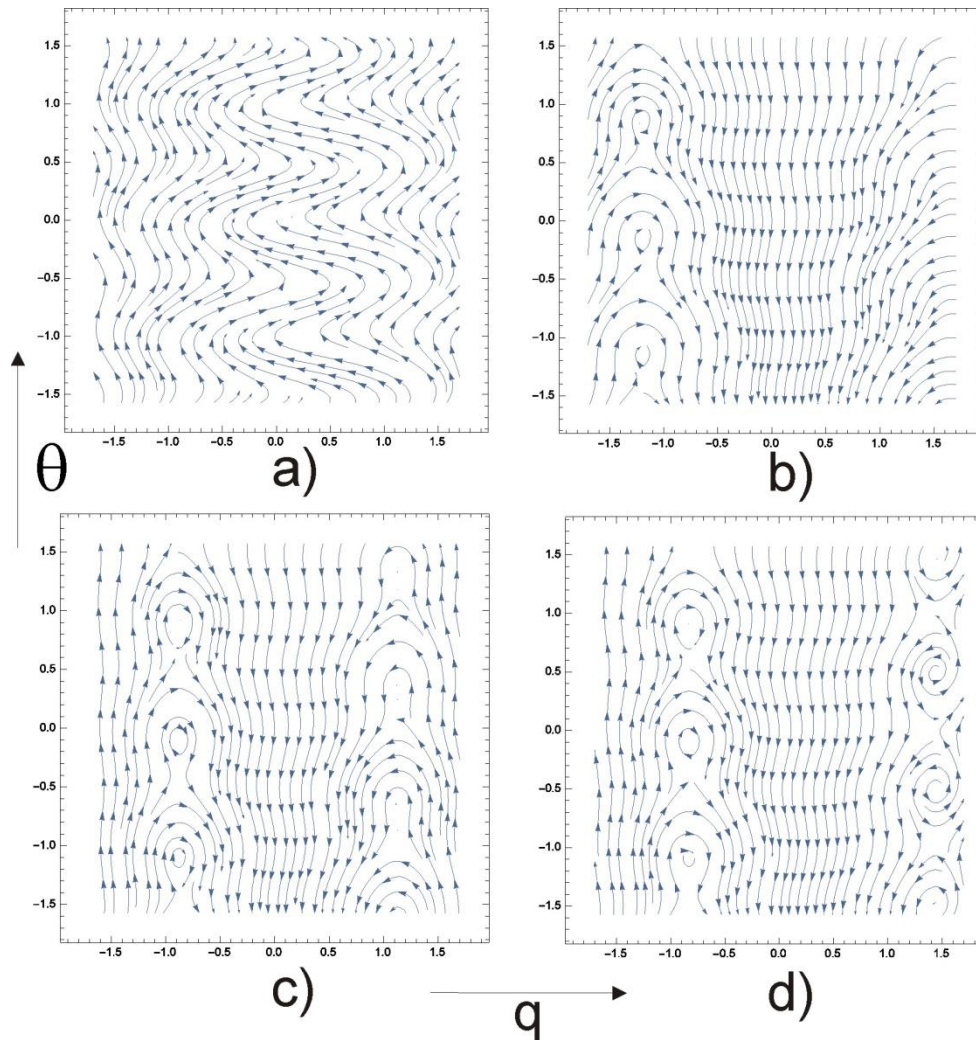
# Slow surface of a system

The solution of system (2) is in  $\delta(\varepsilon)$ -vicinity of slow surface for almost all  $t$  (Arnold).



# Directions field and stationary points(SP)

Let us denote *index* – a number of different types of SP of system (2)



a) No SP

b) index=2

c,d) index=4

Existence of SP



Complicating the nature of  
the behavior of the solution



# Classification of SP

Classification of hyperbolic SP has been performed.

Stationary points  $(q_0^\pm, \theta_n^\pm), n = 1, 2, \dots$  are defined:

$$q_0^\pm = (-a_2/a_3 \pm \sqrt{a_2^2/a_3^2 - 4a_1/a_3})/2 \quad \theta_n^\pm = \frac{\arcsin((b_1 q_0^\pm + b_2 q_0^{\pm 2} + b_3 q_0^{\pm 3})/k)}{2\pi} - n$$

To classify hyperbolic ones let us denote:

$$C(q_0^\pm) = b_1 + 2b_2 q_0^\pm + 3b_3 (q_0^\pm)^2$$

$$\Gamma = \pm 8\pi (2q_0^\pm + a_2/a_3) \sqrt{k^2 - (b_1 q_0^\pm + b_2 (q_0^\pm)^2 + b_3 (q_0^\pm)^3)^2},$$

$$tr_0 = -C,$$

$$\theta_i = 1/2 (i - 1) + l, l \in \mathbb{Z}$$

# Classification of SP

Value of $C, \Gamma$	Value of $tr_0$	Phase	Type of SP
$C^2 > \Gamma$	$tr_0 > 0$	$\theta \in (\theta_1, \theta_2]$	$q_0^+$ unstable node $q_0^-$ saddle
$C^2 > \Gamma$	$tr_0 < 0$	$\theta \in (\theta_1, \theta_2]$	$q_0^+$ Stable node $q_0^-$ saddle
$C^2 > \Gamma$	$tr_0 > 0$	$\theta \in (\theta_3, \theta_4]$	$q_0^+$ saddle $q_0^-$ unstable node
$C^2 > \Gamma$	$tr_0 < 0$	$\theta \in (\theta_3, \theta_4]$	$q_0^+$ saddle $q_0^-$ Stable node
$C \neq 0, C^2 < \Gamma$	$tr_0 < 0$	-	Stable focus
$C \neq 0, C^2 < \Gamma$	$tr_0 > 0$	-	Unstable focus

# Stationary points and scheme of the treatment (G1)

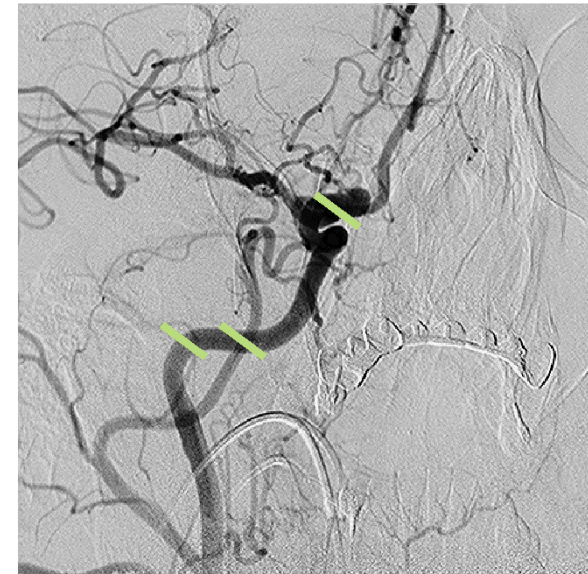
before the operation



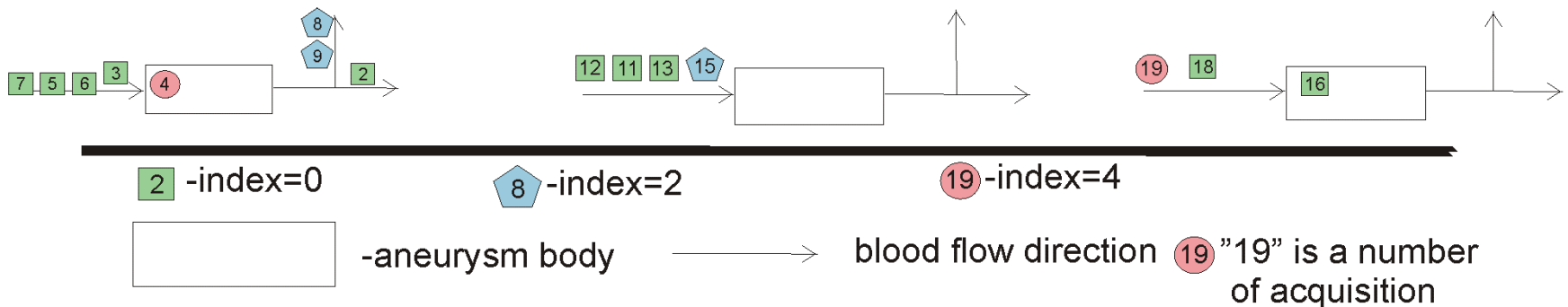
during the operation



after the operation



## Scheme of the measurements and number of the singularities (*Patient G1.*)



# Artery test. Statistics of confirmation

**Note.** Aneurysm position corresponds to system (2), which has **index**  $\neq 0$  at this position.

**confirmation of the test is 83%.**

Patient ID	Gender, Age	Type of CA	Aneurysm location	confirmed
G1	M,42	Normal	ICA	+
K1	F,65	Giant	ICA	+
P1	M,68	Normal	MCA	+
P2	F,65	Giant	ICA	+
R1	F,47	Giant	Bifurcation of BA	+/-
S1	M,40	Normal	Bifurcation of basilar apex	+
T1	F,67	Giant	ICA	-

# Damping of the circulation

The governing equation is

$$\varepsilon \underline{q''} + \underline{(a_1 + a_2 q + a_3 q^2)q'} + \underline{(b_1 q + b_2 q^2 + b_3 q^3)} = ku$$

These agregats represent

$$P(q) = a_0 + a_1 q + a_2 q^2, \quad \text{-damping}$$

$$Q(q) = b_1 q + b_2 q^2 + b_3 q^3 \text{-elastic properties of the system}$$

Let us denote the quantities

$$P_1(q) \quad \text{-damping before the treatment}$$

$$P_2(q) \quad \text{-damping after the treatment}$$

# Damping alterations before and after the treatment

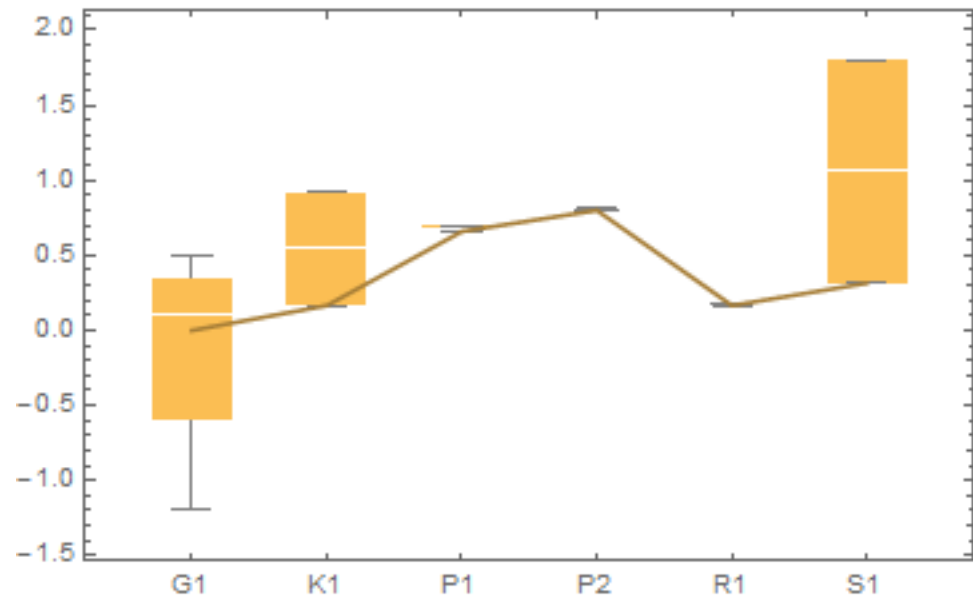
Let us consider the point  $q_0$ , where:

$$q_0: P_1(q_0) - P_2(q_0) = \max(P_1(q) - P_2(q)) \text{ for all } q$$

Let us define the alteration of the damping of the system:

$$\Delta = (P_1 - P_2) / P_1.$$

We have to norm this subtraction by  $P_1$  value due to the big difference in values of  $P_1$  and  $P_2$  for the different measurements and different patients.

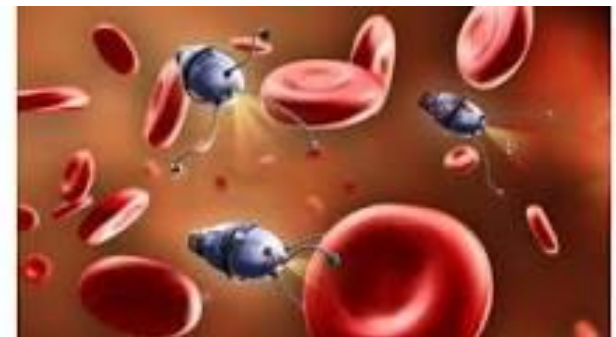


$\Delta$  median value is over the zero.  
Damping is decreasing!

# Conclusion

- The criterion to characterize vessel wall properties is obtained.
- + Such criterion is useful to develop a perspective embolization system.
- + Damping analysis could be useful to value the quality of embolization.
- It was illustrated that Nyquist plot could be separate on several cohorts with respect to aneurysm type.

Li et al, Small 2016,  
DOI: 10.1002/smll.201601846



# Team

- Alexander Chupakhin – LIH, NSU,
- Daniil Parshin – LIH SB RAS, NSU,
- Alexander Cherevko – LIH SB RAS, NSU,
- Elizaveta Bord – LIH SB RAS, NSU,
- Kirill Orlov – Meshalkin Clinic
- Alexey Krivoshapkin – Meshalkin Clinic



# References

1. A.A. Cherevko, A.V. Mikhaylova, A.P. Chupakhin, I.V. Ufimtseva, A.L. Krivoshapkin, K.Yu. Orlov Relaxation oscillation model of hemodynamic parameters in the cerebral vessels. Journal of Physics: Conference Series. V.722. 2016. 012045., 2016, DOI:10.1088/1742-6596/722/1/012045

2. D.V. Parshin, I.V. Ufimtseva, A.A. Cherevko, A.K. Khe, K.Yu. Orlov, A.L. Krivoshapkin, A.P. Chupakhin Differential properties of Van der Pol — Duffing mathematical model of cerebrovascular haemodynamics based on clinical measurements. Journal of Physics: Conference Series. V.722. 2016. 012030., 2016, DOI:10.1088/1742-6596/722/1/012030

# References

- 6. G.Ausitn, Biomathematical model of aneurysm of the circle of willis, i: the duffing equation and some approximate solutions, Mathematical Biosciences, 11, 1-2, 1971 , DOI: [10.1016/0025-5564\(71\)90015-0](https://doi.org/10.1016/0025-5564(71)90015-0),p.163-172
- 7. J. Cronin, Biomathematical Model of Aneurysm of the Circle of Willis I: A Qualitative Analysis of the Differential Equation of Austin, Mathematical Biosciences, 16, p.209-225, 1973, DOI: [10.1016/0025-5564\(73\)90031-X](https://doi.org/10.1016/0025-5564(73)90031-X)
- 8. J.J. Nieto, A.Torres, Approximation of solutions for nonlinear problems with an application to the study of aneurysms of the circle of Willis, [Nonlinear Analysis: Theory, Methods & Applications](#), 40, p.512-521, 2000, DOI: [10.1016/S0362-546X\(00\)85030-0](https://doi.org/10.1016/S0362-546X(00)85030-0)

**Thank you for your attention!**