

# Mathematical and numerical modeling of gene network functioning.

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*Joint work with*

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**Our main goal is to give a mathematical explanations, and predictions to numerical experiments with nonlinear dynamical systems of chemical kinetics considered as models of gene networks regulated by *combinations* of **negative and positive feedbacks**.**

**In our previous publications on the gene networks modeling we have considered the particular cases of very special types of the right hand sides of the equations.**

**A.N.Kolmogorov, I.G.Petrovskii, N.S.Piskunov  
Moscow University Herald, 1937.**

# 1. Some simple gene networks models.

We study odd-dimensional dynamical systems  $(2k+1)$

$$\frac{d x_1}{d t} = f_1(x_{2k+1}) - x_1; \quad \frac{d x_2}{d t} = f_2(x_1) - x_2; \dots \quad \frac{d x_{2k+1}}{d t} = f_{2k+1}(x_{2k}) - x_{2k+1}.$$

The functions  $f_i(u) \rightarrow 0$  are smooth and monotonically decreasing. This corresponds to the negative feedbacks in the gene networks.

**P 1.** Each system of the type  $(2k+1)$  has exactly one stationary point  $S_0$  in the positive octant:

$$x_1 = f_1(f_{2k+1}(f_{2k}(\dots f_2(x_1)\dots))).$$

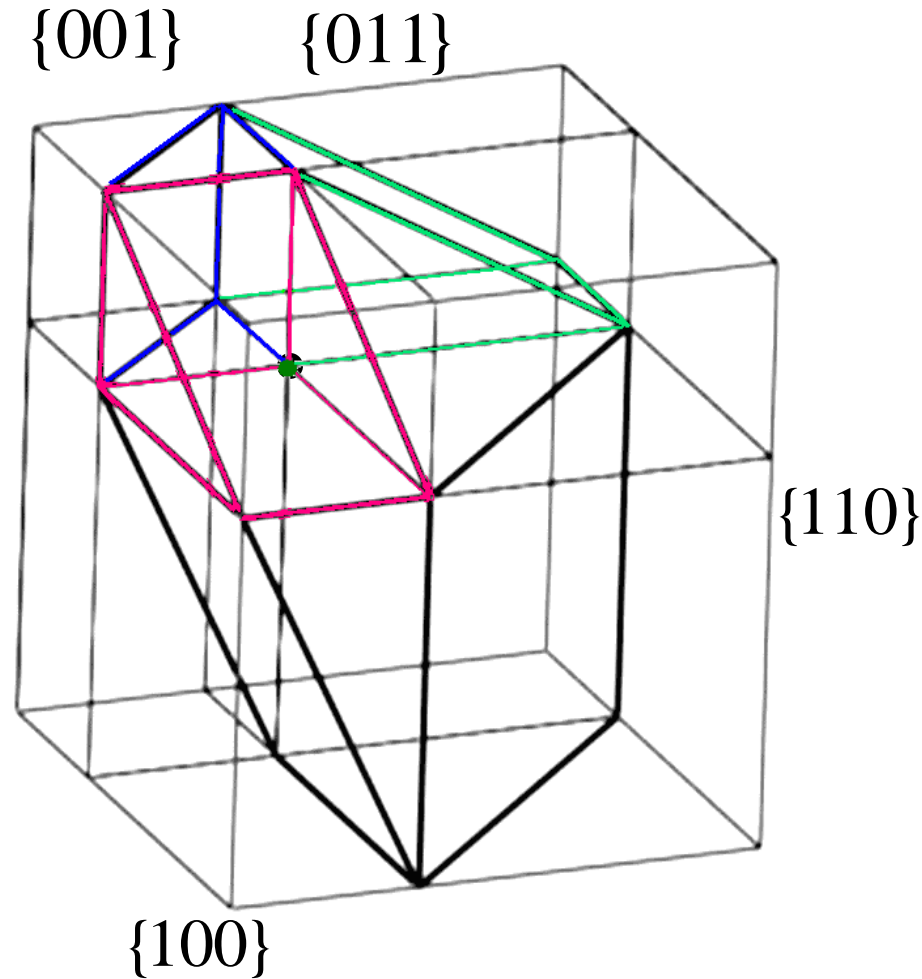
**P 2.**  $Q = [0, f_1(0)] \times [0, f_2(0)] \times \dots [0, f_{2k+1}(0)]$

is an invariant domain of the system  $(2k+1)$ .  $+(2k)$

# Non-convex 3D invariant domain in $Q$ 4/50 composed by six triangle prisms.

$$F = \{011\} \cap \{001\};$$

$$F_1 = \{101\} \cap \{001\}.$$



*Hastings S.,  
Tyson J.,  
Webster D.  
(1977)*

$\{001\} \rightarrow \{011\} \rightarrow \{010\} \rightarrow \{110\} \rightarrow \{100\} \rightarrow \{101\} \rightarrow \{001\}$

**Theorem 1.** If the stationary point  $S_0$  is hyperbolic then the system  $(2k+1)$  has at least one periodic trajectory in the invariant domain  $Q$ .

The following diagram ( $D$ ) shows the discrete scheme of some of the trajectories of the system  $(2k+1)$ .

$$\{1010\dots 01\} \rightarrow \{0010\dots 01\} \rightarrow \{01101\dots 01\} \rightarrow \{010010\dots 01\} \rightarrow \dots$$

$$\rightarrow \{1010\dots 0110\} \rightarrow \{1010\dots 100\} \rightarrow$$

We reduce this invariant domain  $Q$  to the union of  $4k+2$  triangle prisms in order to localize the position of the cycle.

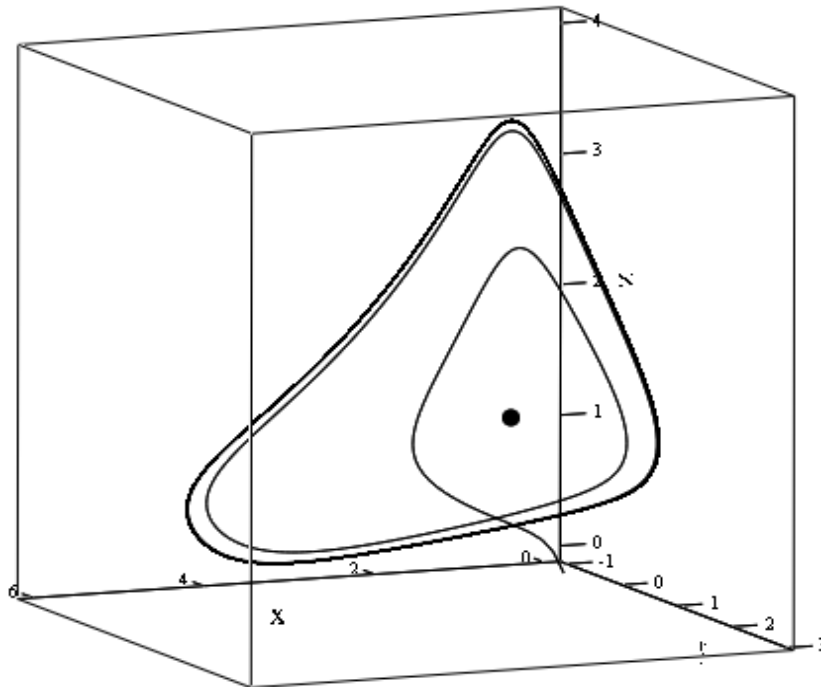
Then existence of periodic trajectories follows from the **Brower's fixed point theorem**.

$$\frac{dx}{dt} = \frac{6}{1+z^5} - x;$$

$$\frac{dy}{dt} = \frac{3}{1+x^7} - y;$$

$$\frac{dz}{dt} = 7e^{-5y} - z;$$

**A trajectory and a limit cycle.**

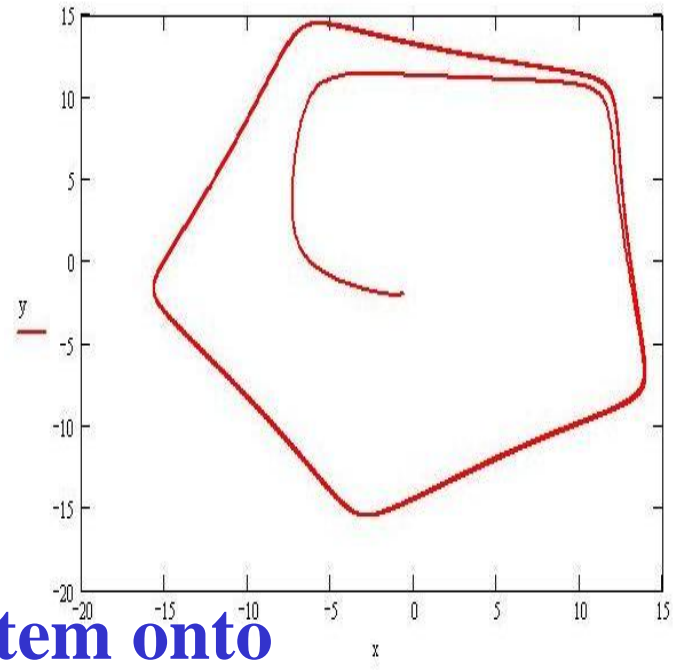
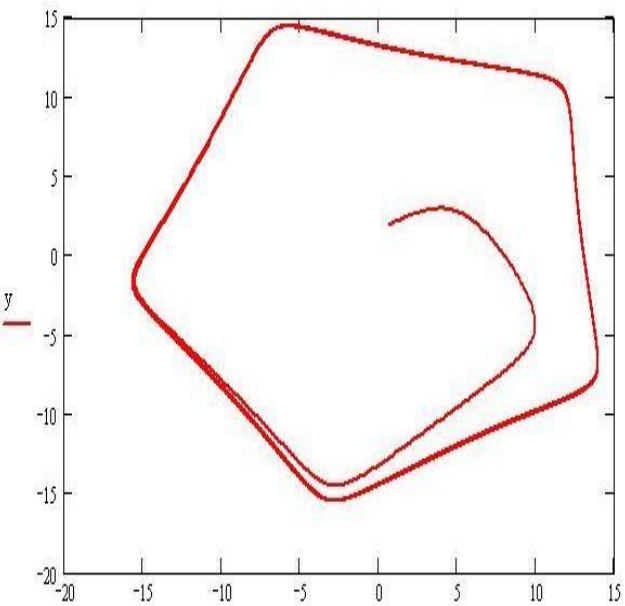


## Below we demonstrate projections of trajectories of symmetric 5-D system

$$\frac{dx_i}{dt} = \frac{18}{1+x_{i-1}^3} - x_i, \dots \quad i = 1, 2, 3, 4, 5; \quad S_0 = (2, 2, 2, 2, 2).$$

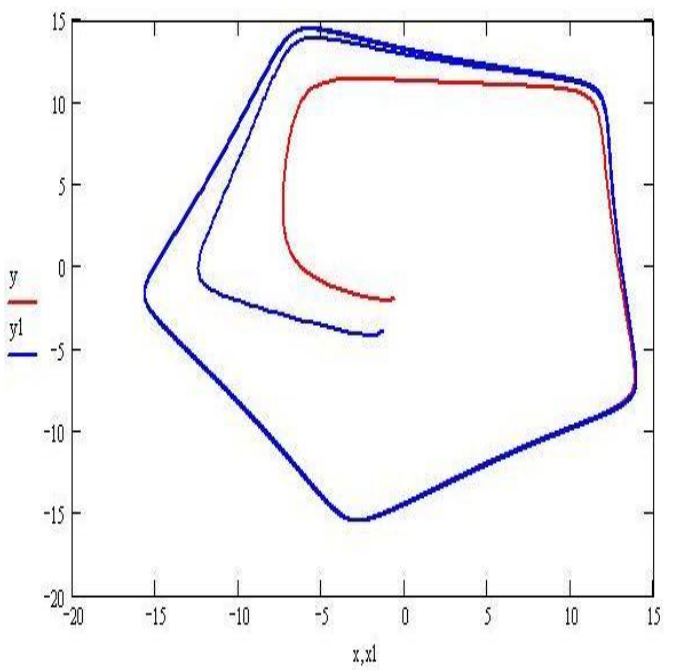
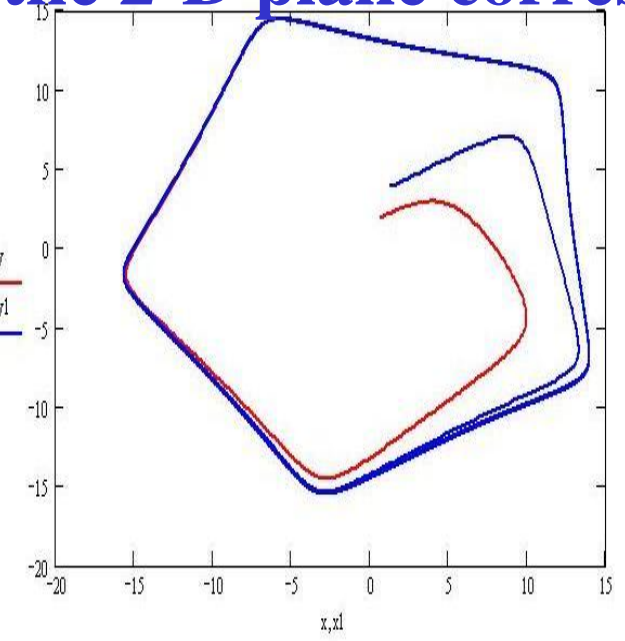
onto 2-D and 3-D planes.

**Theorem 1'.** If the dynamical system  $(2k+1)$  in the Th.1 is symmetric with respect to the cyclic permutation of the variables then the system has a cycle with corresponding symmetry.



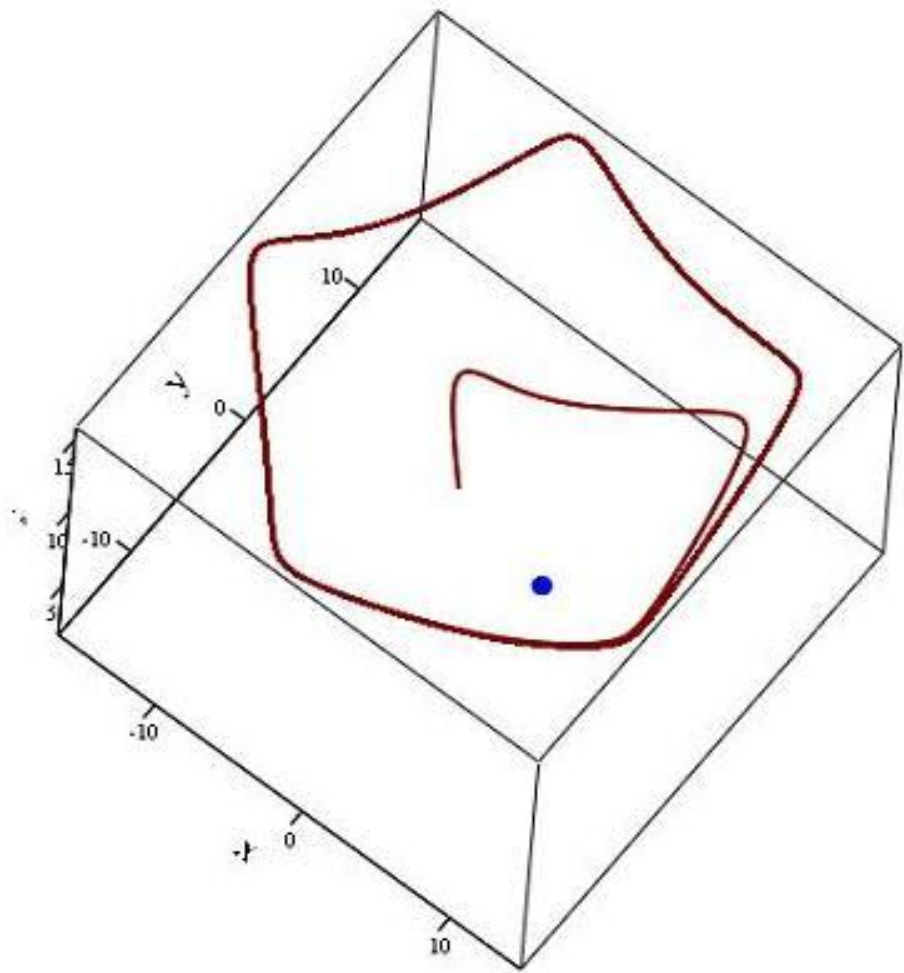
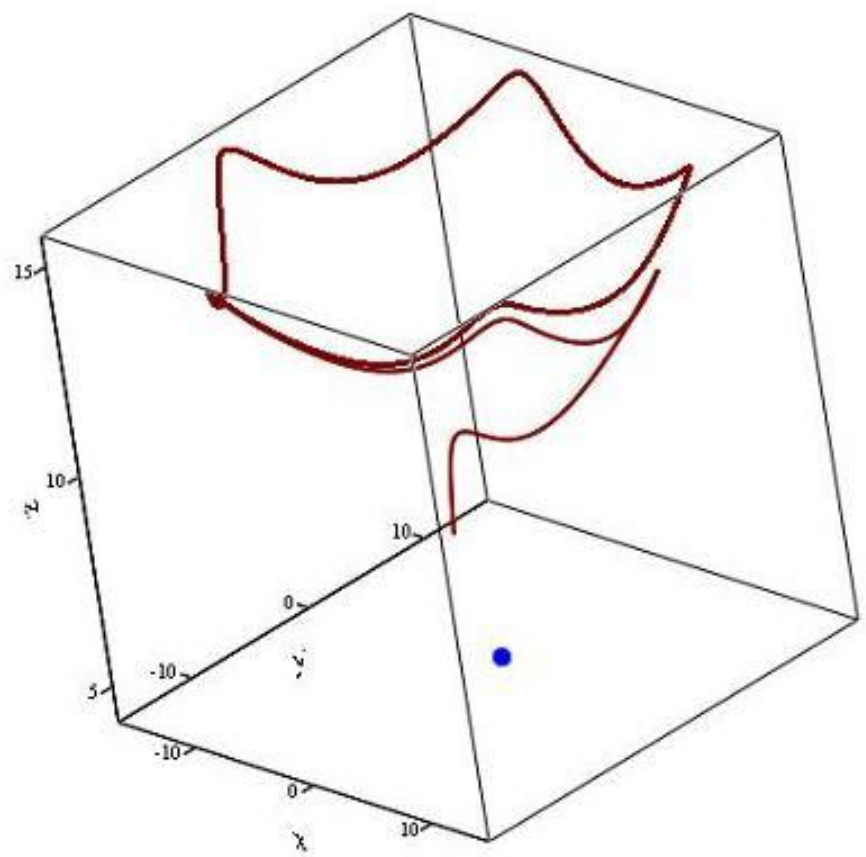
Projections of trajectories of 5-D system onto the 2-D plane corresponding to

$$\text{Re } \lambda_4 = \text{Re } \lambda_5 > 0.$$





# Projections of trajectories of the 5-D system onto the 3-D plane corresponding to the eigenvalues with positive real parts and the negative eigenvalue $\lambda_1 < 0$ of the linearization matrix.



The blue spot shows the position of projection of the stationary point.

$(x_1, y_1, z_1), (rp_1, rp_2, rp_3)$

$(x_1, y_1, z_1), (rp_1, rp_2, rp_3)$

The characteristic polynomial of the linearization of the system  $(2k+1)$  at the stationary point  $S_0$  has the form

$(1 + \lambda)^{2k+1} + \Pi^{2k+1} = 0$ . Here  $-\Pi^{2k+1}$  is the product of all derivatives  $\partial f_i / \partial x_{i-1}$  at the point  $S_0$ .

We arrange the eigenvalues of this linearization according to the values of their real parts:

The eigenvalue  $\lambda_1$  is real and negative. So,

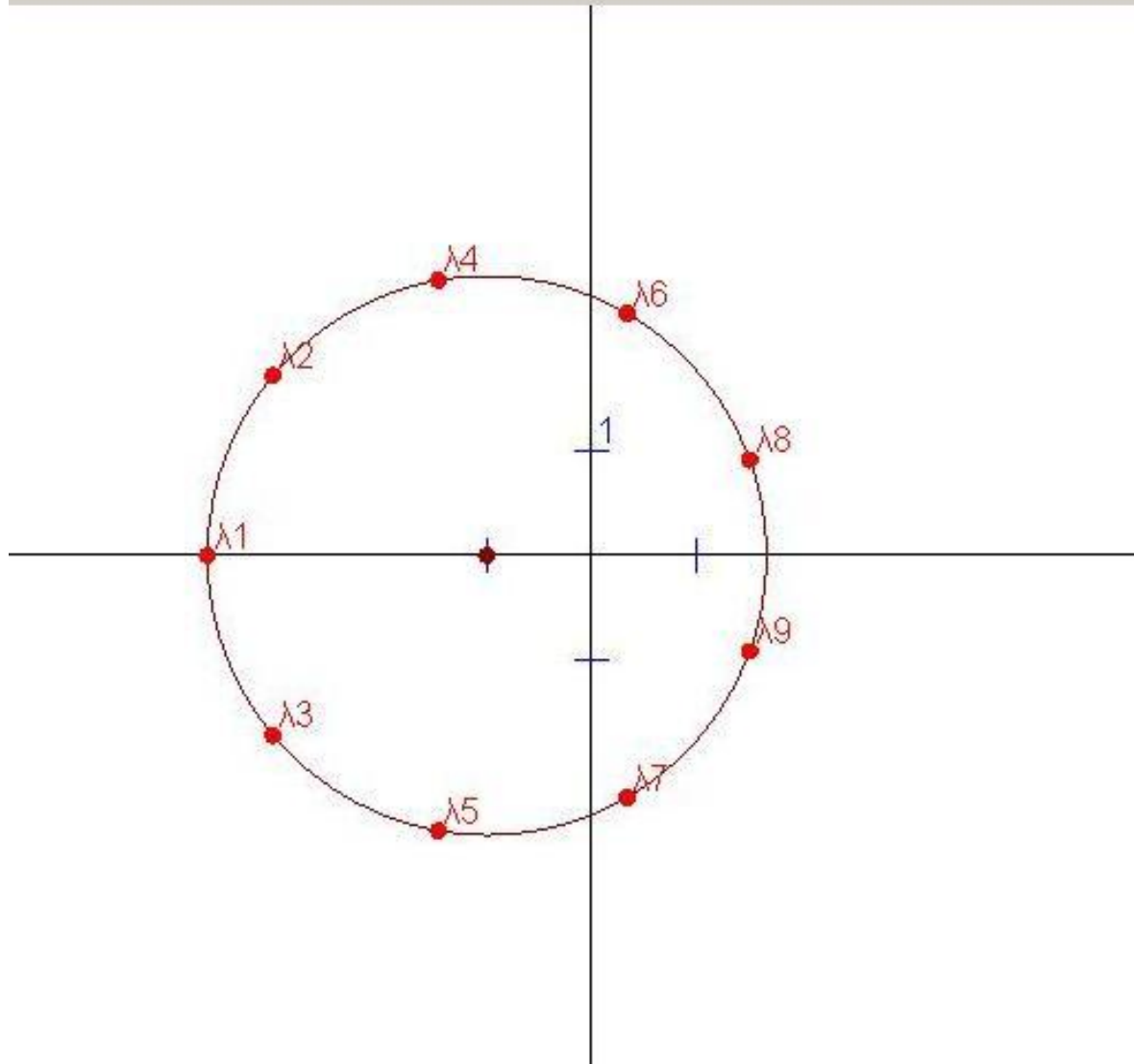
$$\lambda_1 < \operatorname{Re} \lambda_{2,3} < \operatorname{Re} \lambda_{4,5} < \dots < \operatorname{Re} \lambda_{2k,2k+1}.$$

If the point  $S_0$  is **hyperbolic** then none of these real parts vanishes.

If  $k=2$  then  $\lambda_1 < \operatorname{Re} \lambda_{2,3} < 0$ .

# Eigenvalues of one 9-D symmetric dynamical system

```
x_1: [2.000, 2.000, 2.000, 2.000, 2.000, 2.000, 2.000, 2.000, 2.000]
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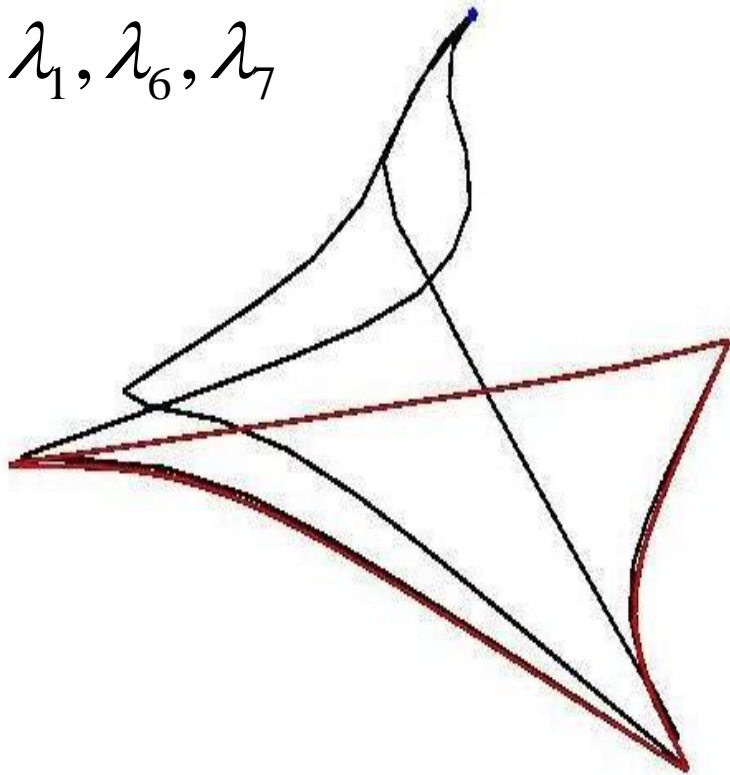


# Trajectories of 9-D symmetric system

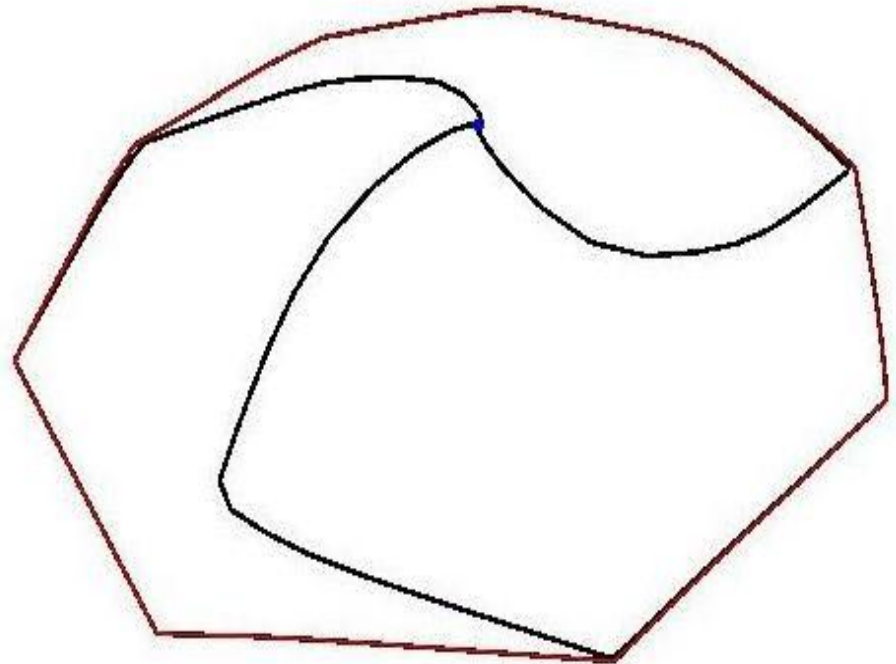
$$\frac{dx_i}{dt} = \frac{130}{1+x_{i-1}^6} - x_i, \dots$$

projected onto 3D-planes corresponding to different eigenvectors of the linearization of this system near the stationary point. The trajectories are contained in ( $D$ ).

$\lambda_1, \lambda_6, \lambda_7$



$\lambda_1, \lambda_8, \lambda_9$



**Similar results can be obtained for the systems of the types**

$$\frac{dx_1}{dt} = f_1(x_3) - g(x_1) , \quad \frac{dx_2}{dt} = f_2(x_1) - g(x_2),$$

$$\frac{dx_i}{dt} = F_i(x_{i-1}, x_i), \quad \frac{\partial F_i}{\partial x_i} < 0, \quad \frac{\partial F_i}{\partial x_{i-1}} < 0,$$

**etc.**

**M.Hirsch (1987).**

## 2. Stability questions.

$$\frac{dX}{dt} = A \cdot X + \Psi(X); \quad (\text{VM})$$

$$A = \begin{pmatrix} -1 & 0 & -\eta \\ -\eta & -1 & 0 \\ 0 & -\eta & -1 \end{pmatrix}; \quad \Psi(X) = \begin{pmatrix} \eta \cdot z + f_1(z) \\ \eta \cdot x + f_2(x) \\ \eta \cdot y + f_3(y) \end{pmatrix}.$$

$$\eta > 0.$$

The eigenvalues of  $A$  can be expressed **explicitly**:

$$\lambda_1(A) = -1 - \eta; \operatorname{Re} \lambda_{2j, 2j+1}(A) = \dots$$

# The transfer matrix

$$\chi(i\omega - 1 + \nu) := ((i\omega - 1 + \nu)E - A)^{-1},$$

$$\mu(\nu) = \sup_{\omega} |\chi(i\omega - 1 + \nu)|.$$

**Let**  $\Psi'(X)$  **be the Jacobi matrix of**  $\Psi(X)$ ,

**and let**  $\|\Psi'_X\| = \max_i \sup_X (|4\eta + f'_i|)$

$i = 1, 2, \dots$  **be its norm.**

Russel Smith has shown that *if*  $|\Psi'_x| < (\mu(v))^{-1}$

*then the system (VM) has a stable cycle* (1987).

*Actually, he notes that this is not a sharp estimate!!*

**Theorem 2. If the system (2k+1) satisfies the conditions of the theorem 1 and**

$$|\eta + f'_i(x_{i-1})| < \eta \cdot \sin \frac{2\pi}{2k+1} \cdot \sin \frac{\pi}{2k+1}$$

**for some positive  $\eta$  then the invariant domain  $Q'$  contains a stable cycle of this system.**

$$-\eta(1 + \sin 2\varphi \cdot \sin \varphi) < f'_i < -\eta(1 - \sin 2\varphi \cdot \sin \varphi).$$



### 3. Nonuniqueness of cycles in the system $(2k+1)$ .

According to the Grobman-Hartmann theorem, each nonlinear dynamical system can be linearized in some neighborhood  $W$  of its hyperbolic point.

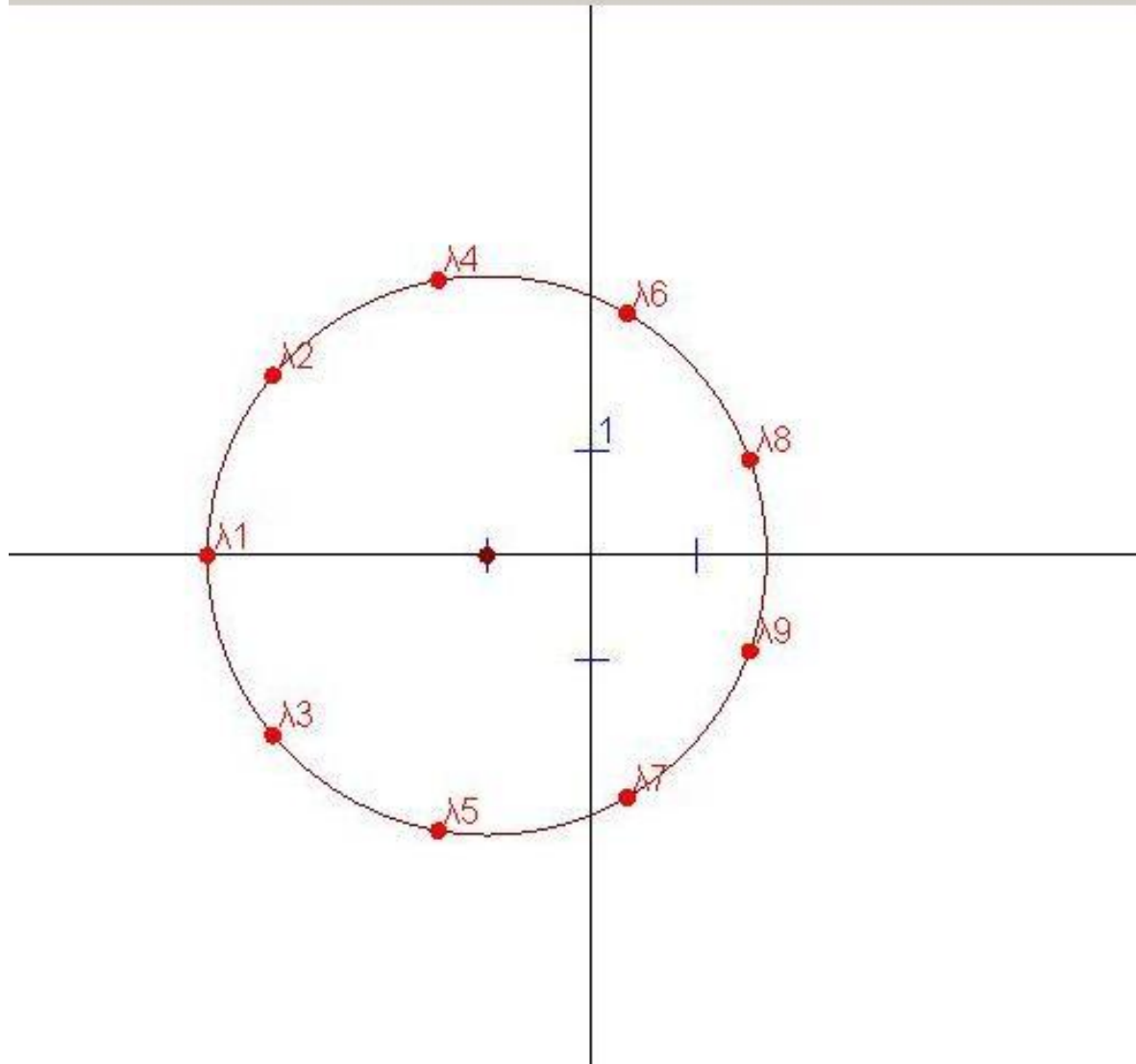
Consider in  $W$  **2-D planes** corresponding to pairs of the eigenvalues with *positive* real parts.

These **planes** are composed by unwinding trajectories of the dynamical system  $(2k+1)$ .

*Hypothesis 1: Outside of  $W$  different **2-D planes** generate different **(??)** cycles.*

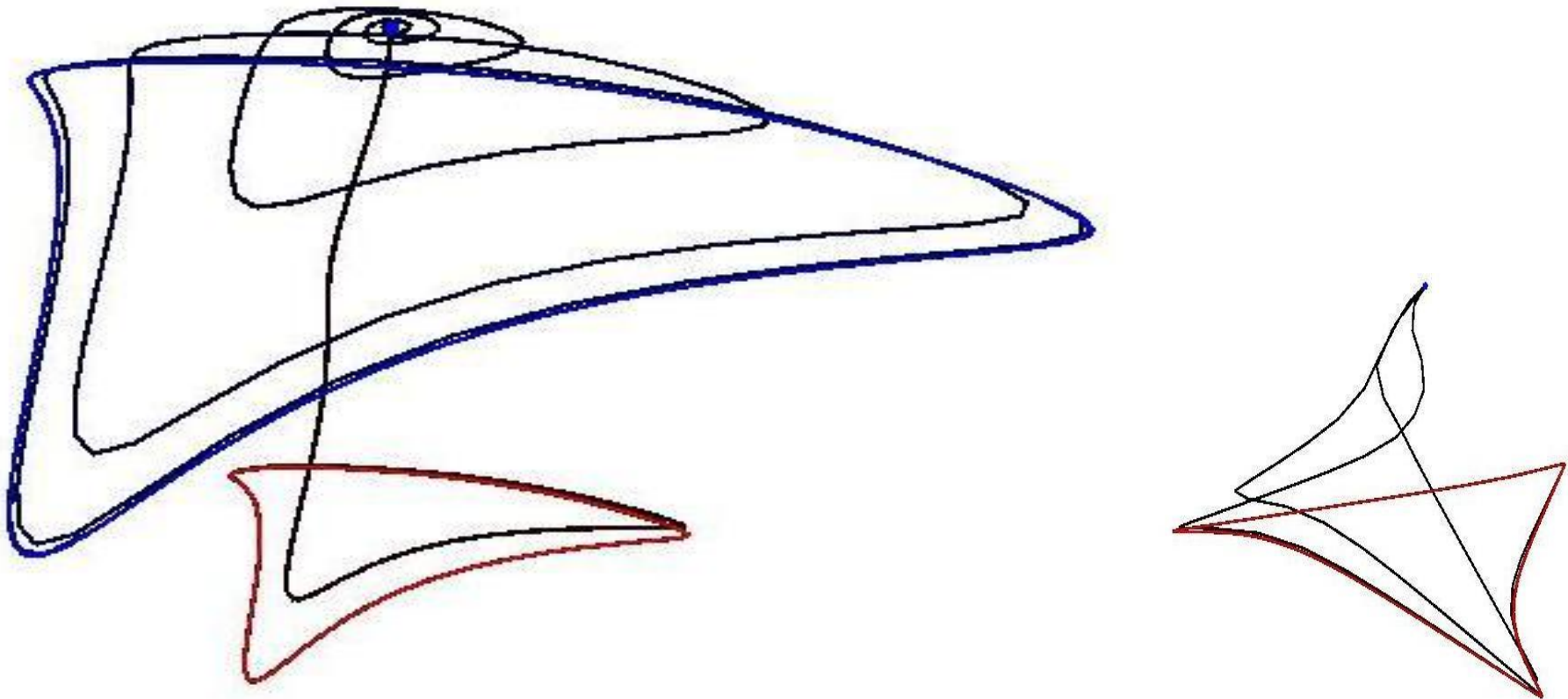
# Eigenvalues of one 9-D symmetric dynamical system

x\_1: [2.000, 2.000, 2.000, 2.000, 2.000, 2.000, 2.000, 2.000, 2.000]



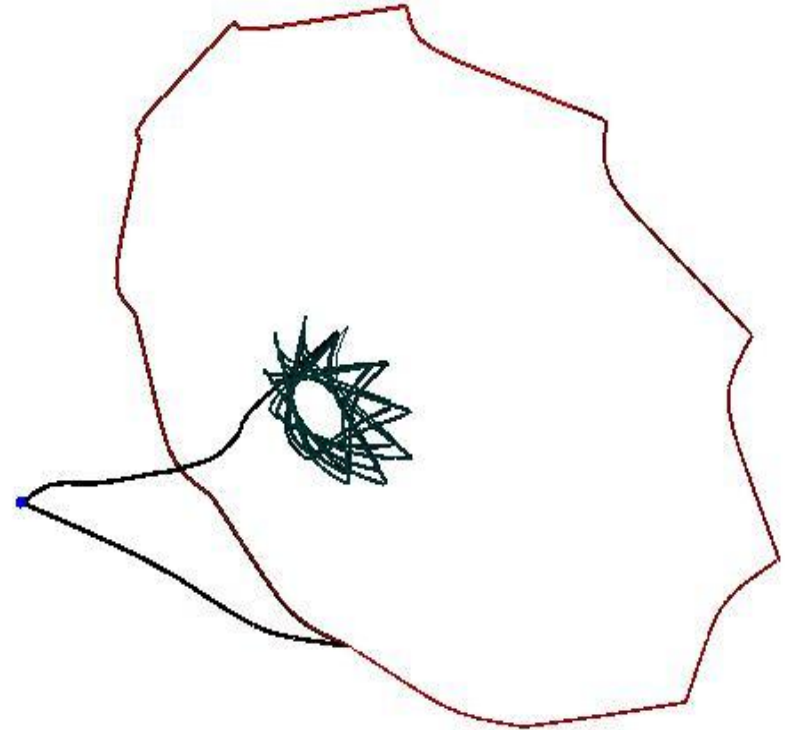
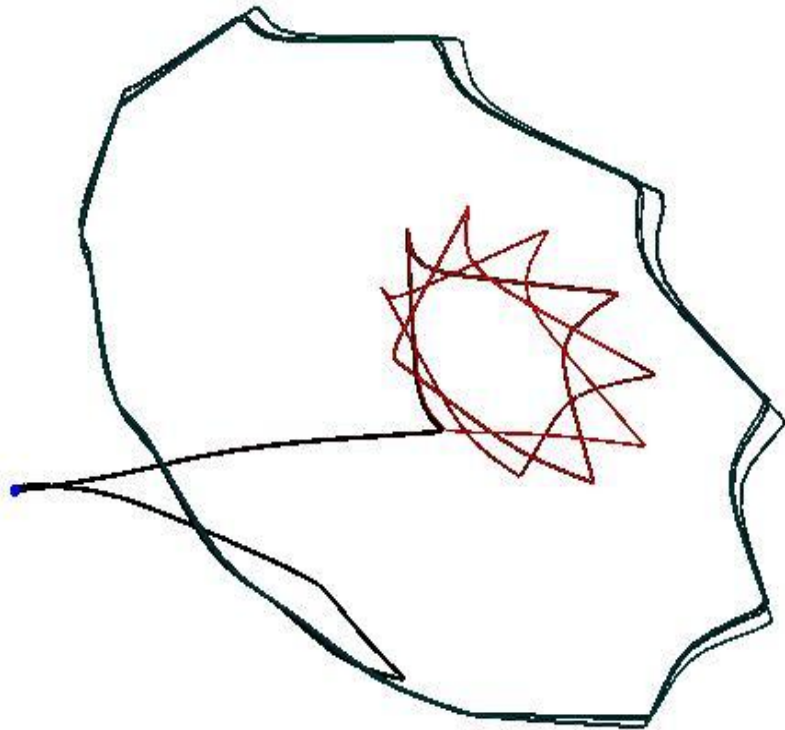
Projections of two different cycles of 9-D symmetric system onto 3-D plane  $\lambda_1, \lambda_6, \lambda_7$ .  
The **second** cycle is not contained in ( $D$ ).

The stationary point is at the top of the picture.

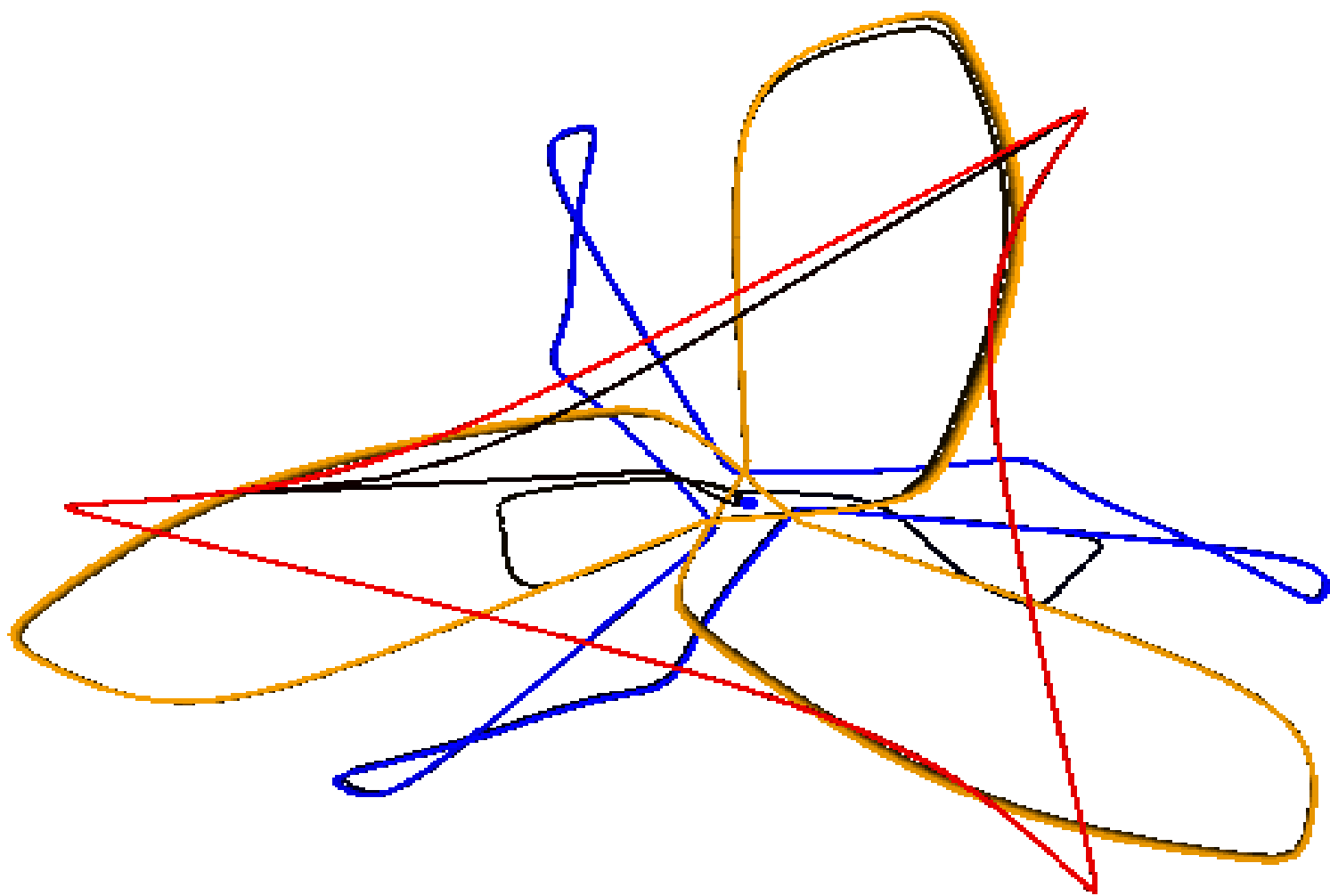


# Projections of two different cycles of 11-D symmetric system onto two different 3-D planes

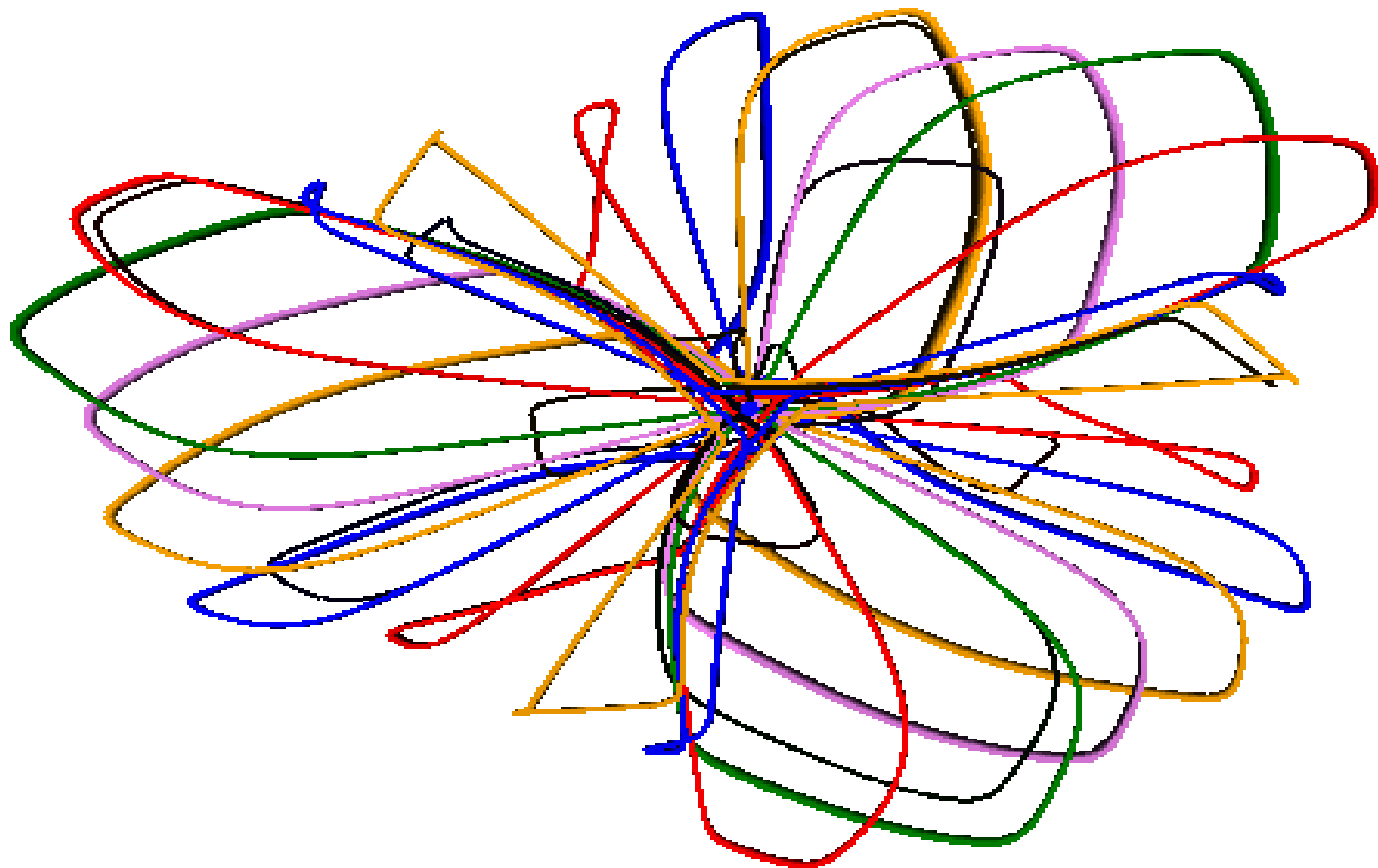
$\lambda_1, \lambda_8, \lambda_9$  left;     $\lambda_1, \lambda_{10}, \lambda_{11}$  right.



# Projections of 3 cycles of 15-dimensional system onto the plane $\lambda_{10}, \lambda_{11}$ .



Same system and plane, 5 cycles.  
*Hypothesis 2: Continuum of cycles???*



## 4. Model of 3-D gene network regulated by a simple combination of **negative** and **positive** feedbacks.

system (ff $\Lambda$ ):

$$\frac{dx_1}{dt} = f_1(x_3) - x_1 ; \quad \frac{dx_2}{dt} = f_2(x_1) - x_2 ; \quad \frac{dx_3}{dt} = \Lambda_3(x_2) - x_3$$

$f_1(x_3), f_2(x_1) : [0, \infty) \rightarrow (0, \infty)$ , **Smooth monotonically decreasing**  $f_i(u) \rightarrow 0$   
for  $u \rightarrow \infty$ .

$$\Lambda_3(x_2) = \frac{ax_2}{1 + x_2^m}$$

or more general **unimodal** function.

Let  $\Lambda_3(y_M)$  be the maximal value of  $z = \Lambda_3(y)$   
 and  $z = \varphi(y)$  is the inverse function to  $y = f_2(f_1(z))$ .

**Lemma 1. Let**  $\varphi(f_2(0)) > \Lambda_3(f_2(0))$ ,

**and either**  $f_2(f_1(0)) > y_M$ ,

**or**  $f_2(f_1(0)) < y_M$ ,  $\varphi(y) < \Lambda_3(y)$  **for**  $0 \leq y \leq y_M$ .

**Then the system (ff $\Lambda$ ) has exactly one stationary point  $S_0(x_0, y_0, z_0)$  in the positive octant.**

**Let**  $x_A, y_A, z_A$  **be defined by**  $z_0 = \Lambda_3(y_A)$ ,

$y_A < y_M < y_0$ ,  $z_A = \varphi(y_A)$ ,  $x_A = f_1(\varphi(y_A))$ .



**Linearization** of system (1) at this point

$S_0(x_0, y_0, z_0)$  is described by the matrix with one negative eigenvalue.

Its other eigenvalues  $\lambda_2, \lambda_3$  are complex.

Consider the case

$$\operatorname{Re} \lambda_2 = \operatorname{Re} \lambda_3 > 0. \quad (+)$$

***Theorem “1”.*** If the condition (+) is satisfied then the system (ff $\Lambda$ ): has at least one periodic trajectory.

The proof is based on existence of an invariant domain of the system ( $\mathbf{ff}\Lambda$ ). This is the parallelepiped  $Q = [0, x_A] \times [y_A, f_2(0)] \times [z_A, \Lambda_3(y_M)]$ .

Actually, one can construct essentially smaller invariant domain (see below).

Now, **existence** of periodic trajectories follows from the **Brower** fixed point theorem, as usual.

Recall that  $z_0 = \Lambda_3(y_A)$ ,

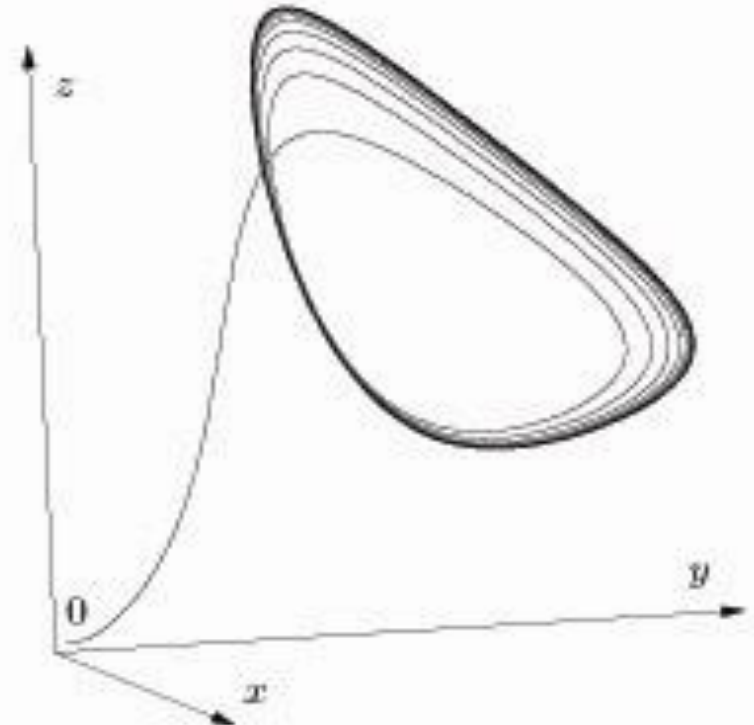
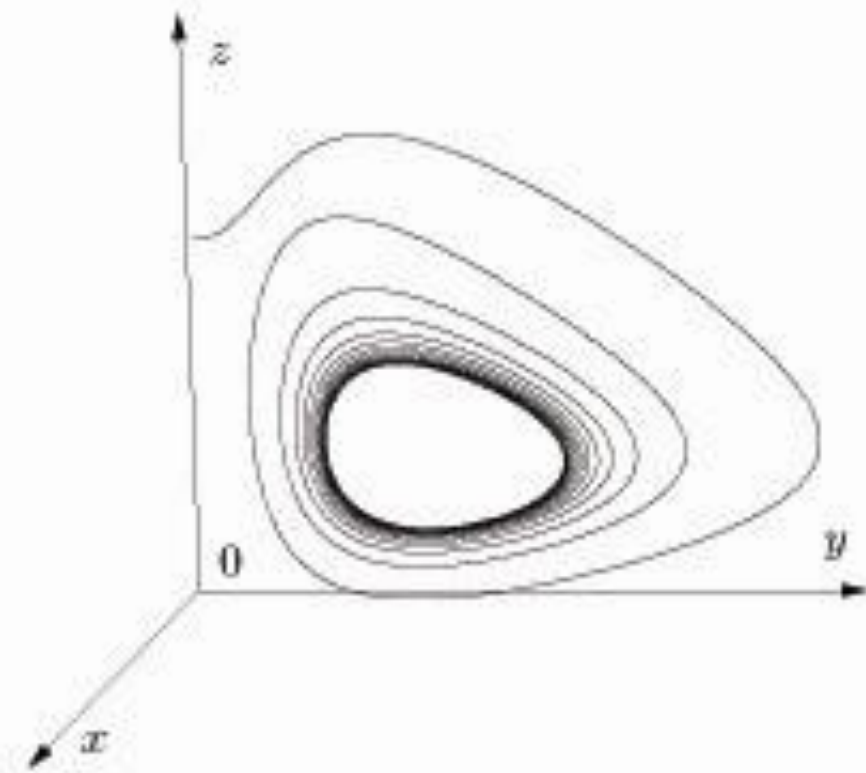
$$y_A < y_M < y_0, \quad z_A = \varphi(y_A), \quad x_A = f_1(\varphi(y_A)).$$

# Trajectories of the system (**ff** $\Lambda$ )

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*right:*  $f_1(z) = \frac{10}{1+z^3}$ ,  $f_2(x) = 10 \cdot e^{-0.135x^2}$ ,  $\Lambda_3(y) = \frac{17y}{1+y^3}$ .

*left:*  $f_1(w) = f_2(w) = \frac{10}{1+z^3}$ ,  $\Lambda_3(y) = \frac{17y}{1+y^3}$ .



# 5. More complicated gene networks models regulated by *combinations* of positive and negative feedbacks.

system (f $\Lambda\Lambda$ ):

$$\frac{dx_1}{dt} = f_1(x_3) - x_1; \quad \frac{dx_2}{dt} = \Lambda_2(x_1) - x_2; \quad \frac{dx_3}{dt} = \Lambda_3(x_2) - x_3$$

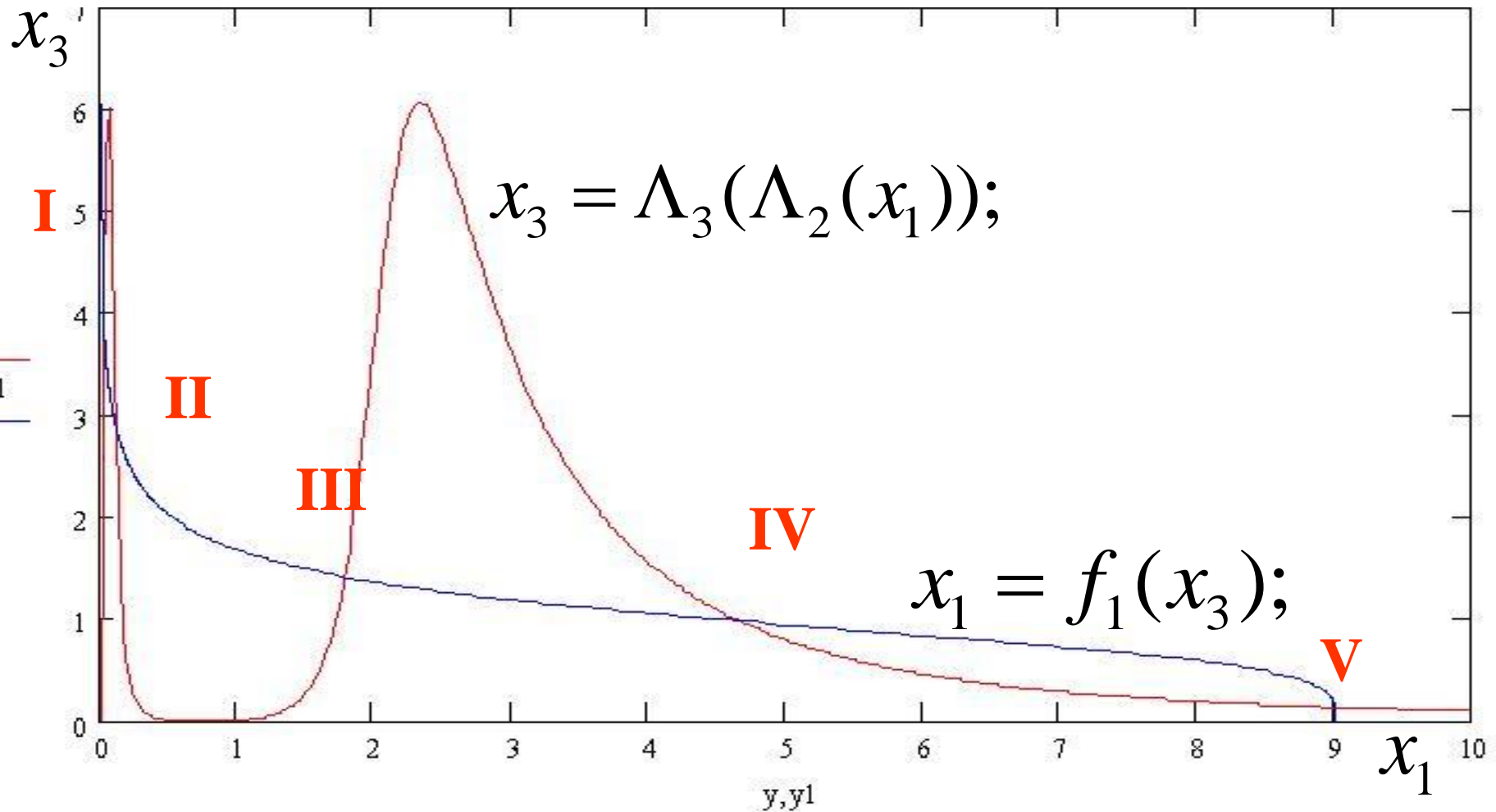
$$f_i(x_{i-1}) : [0, \infty) \rightarrow (0, \infty), \quad f_i(u) \rightarrow 0 \quad \text{for} \quad u \rightarrow \infty.$$

$$\Lambda_j(w) = \frac{a_j w}{1 + w^{m_j}}$$

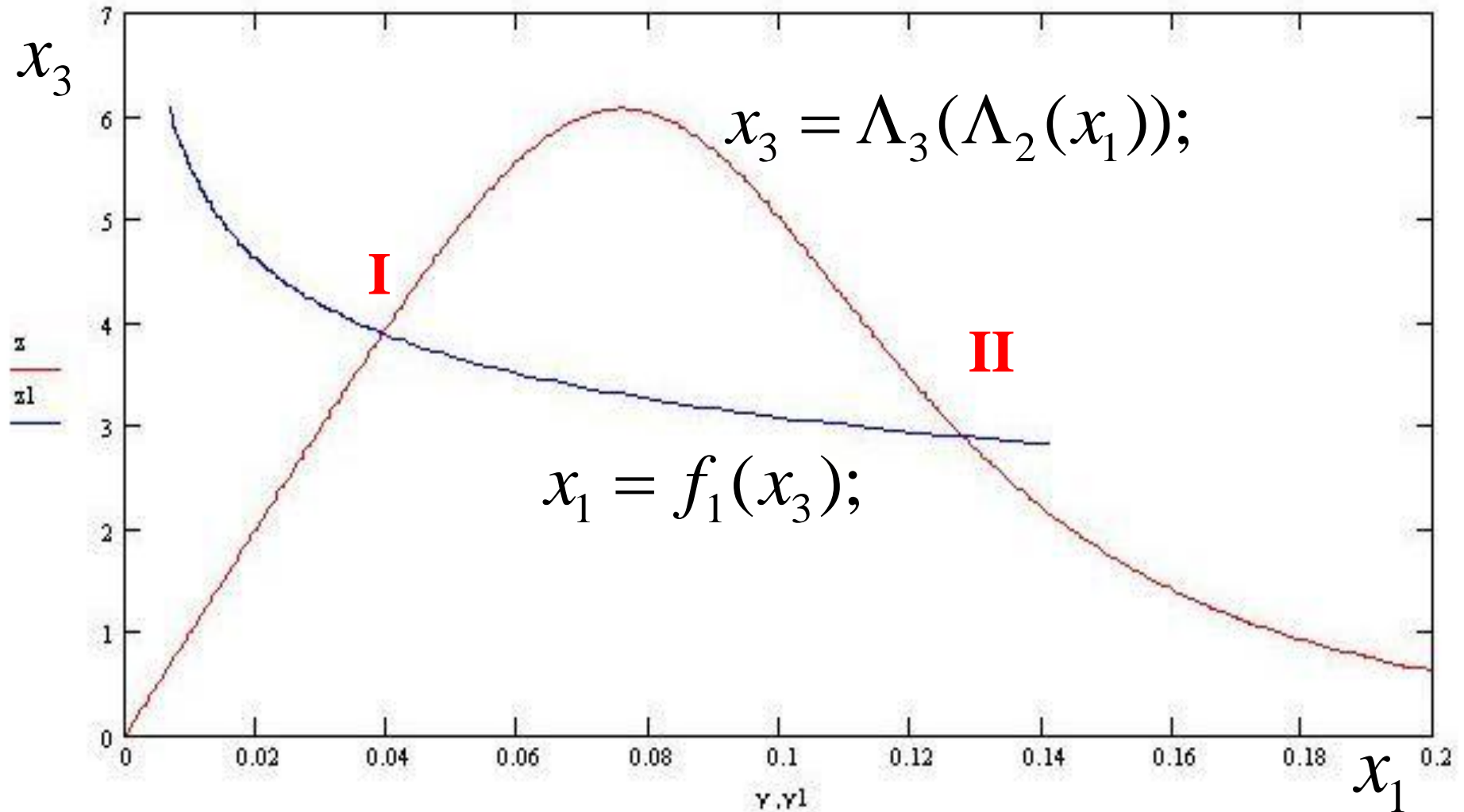
or other unimodal functions.

# Stationary points of the system (f $\Lambda\Lambda$ ).

$$f_1(x_3) = \frac{9}{1+x_3^4}; \quad \Lambda_2(x_1) = \frac{10x_1}{1+x_1^4}; \quad \Lambda_3(x_2) = \frac{10x_2}{1+x_2^5}.$$



# Stationary points **I** and **II** of the system ( $f\Lambda\Lambda$ ):

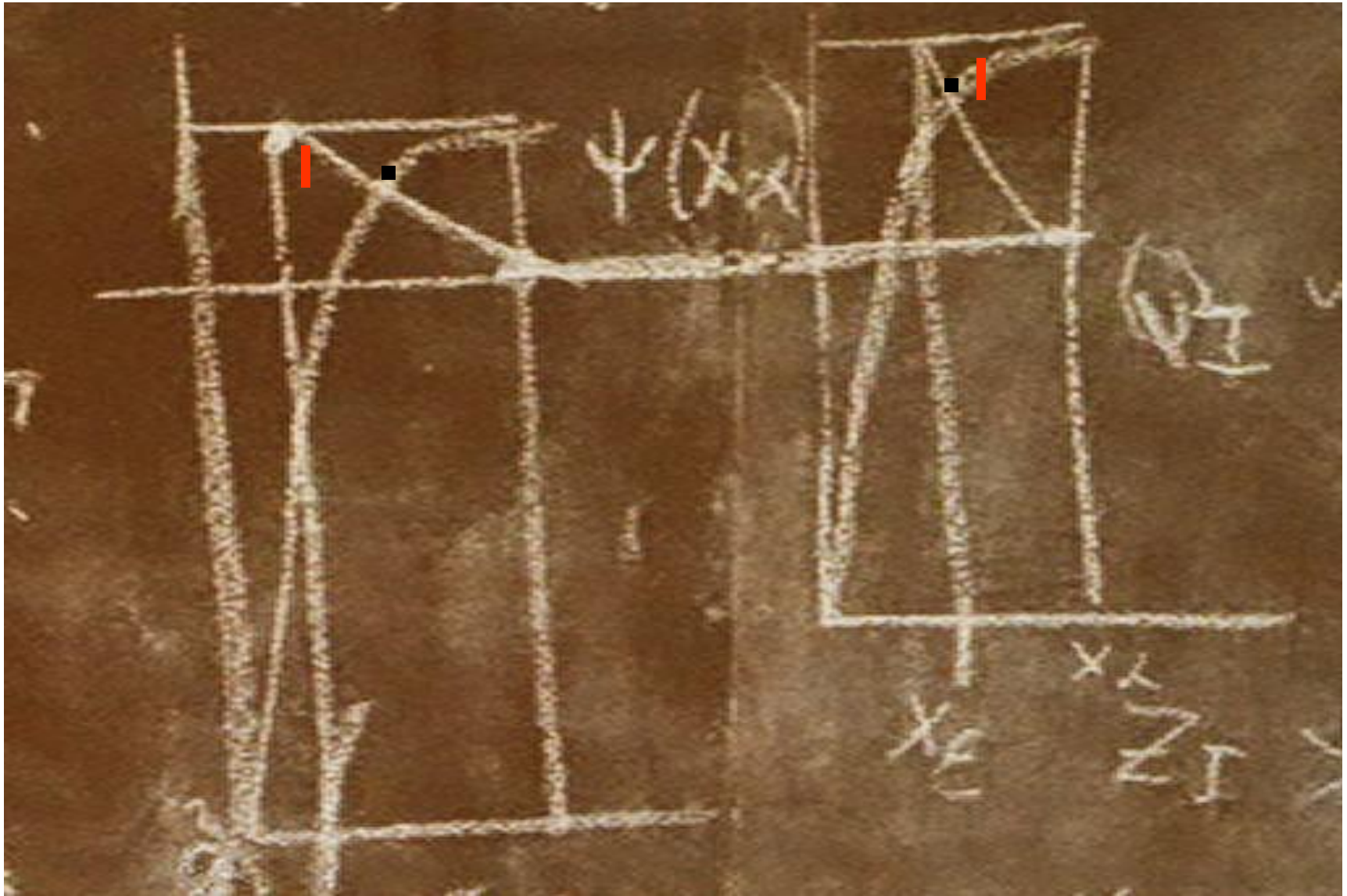


**Analogs of the theorems 1 and 2 about existence of a cycle and existence of a stable cycle hold in the neighborhoods of the stationary points I and III.**

**The stationary point V is stable.**

**The stationary points II and IV have topological index +1.**

Two variants of constructions of invariant neighborhood of the stationary point **I** of the system  $(f, \Lambda)$ :

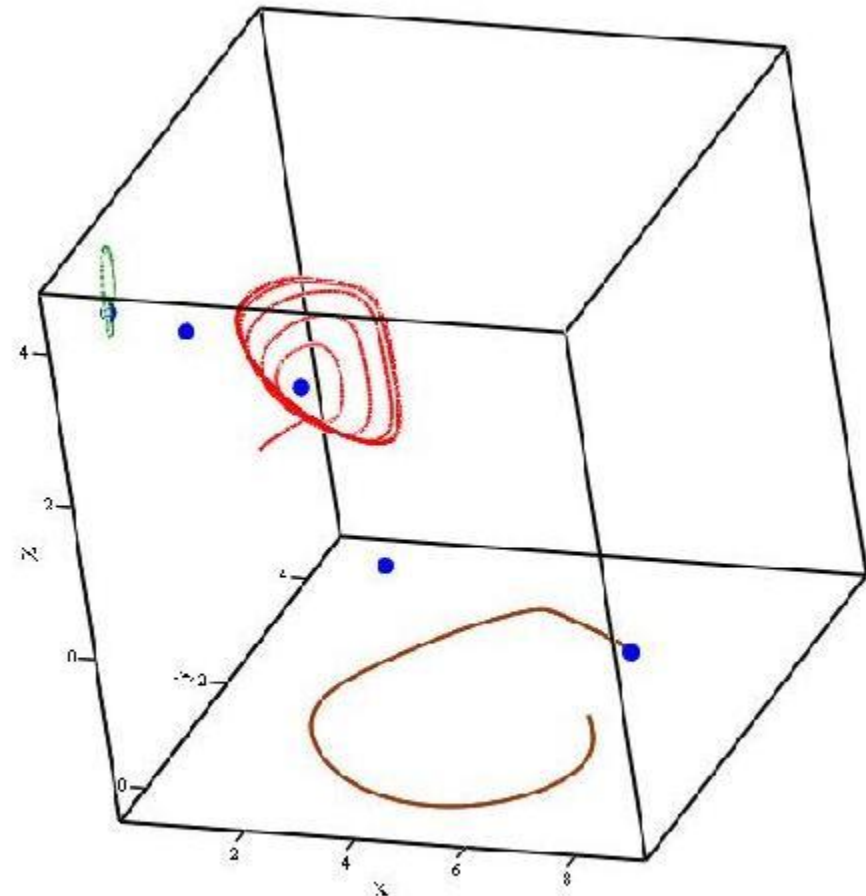
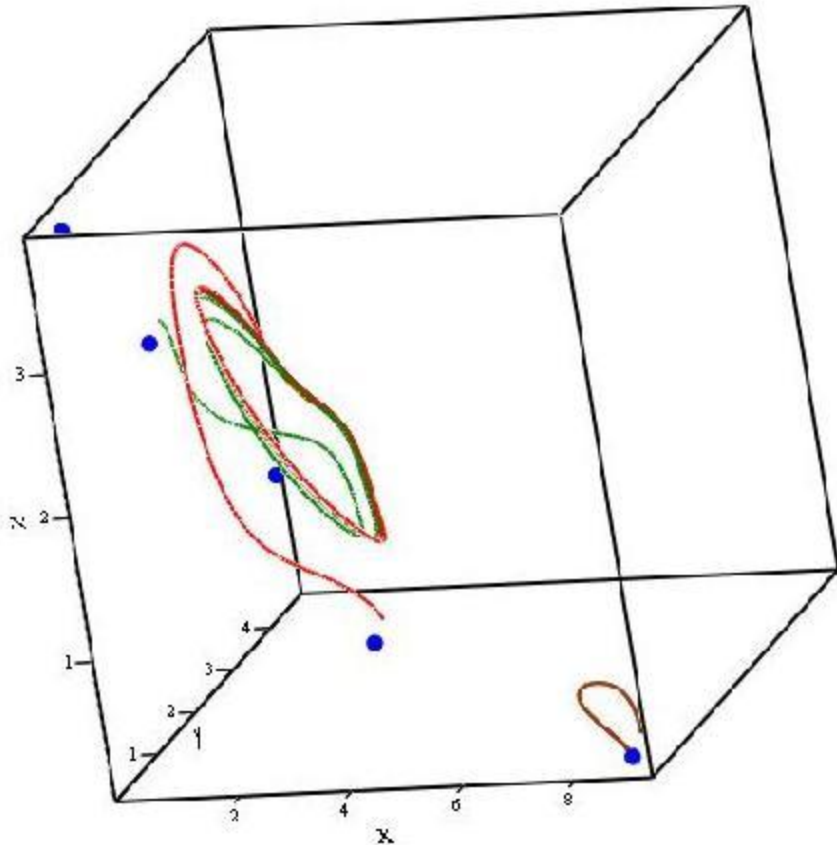






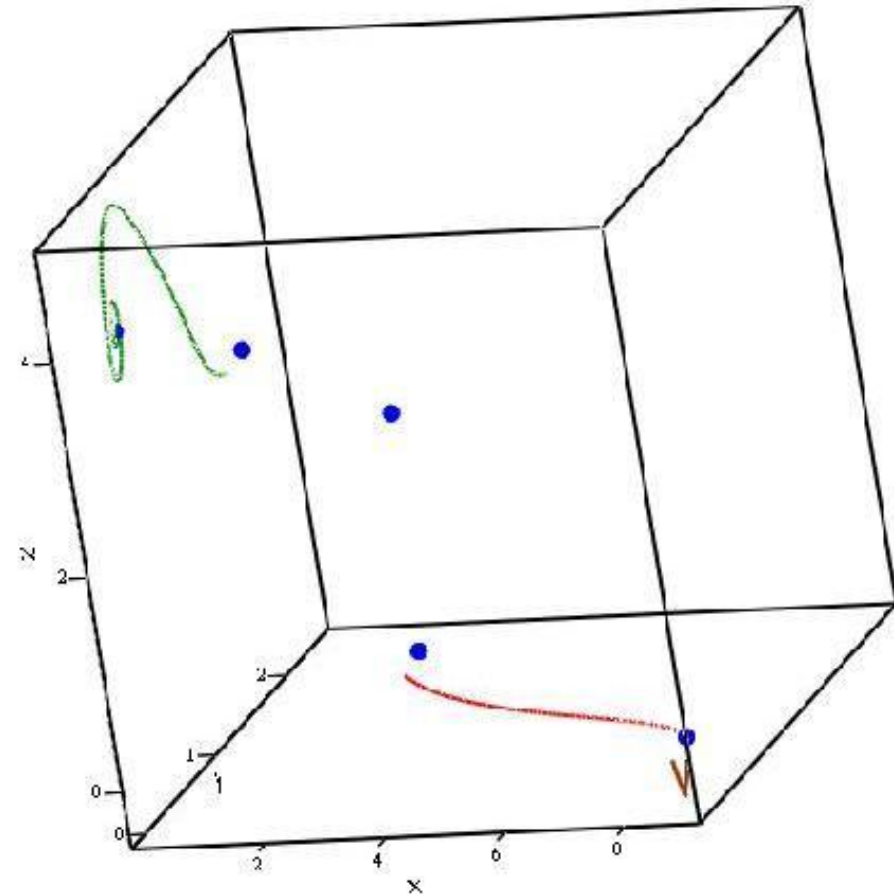
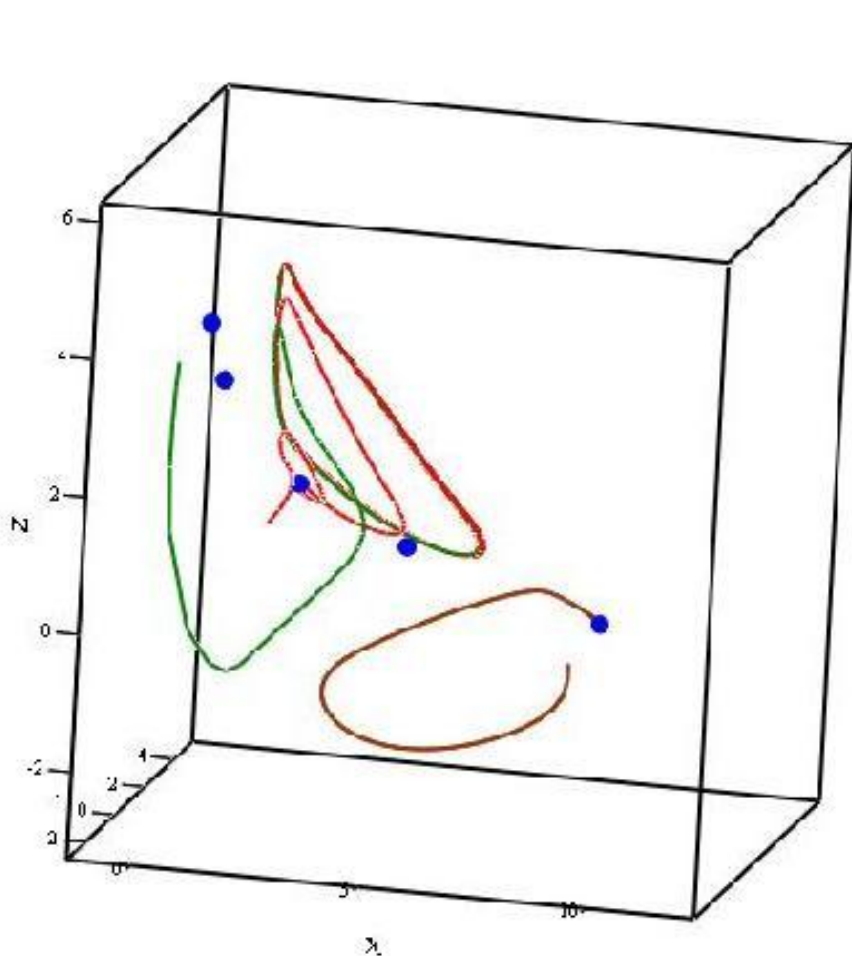
# Stationary points and cycles of the system $(f, \Lambda)$ :

$$f_1(x_3) = \frac{9}{1+x_3^4}; \quad \Lambda_2(x_1) = \frac{10x_1}{1+x_1^4}; \quad \Lambda_3(x_2) = \frac{10x_2}{1+x_2^3}.$$





# Stationary points and cycles of the system $(f_{\Lambda\Lambda})$ (same parameters, other trajectories).



$(u1, u2, u3), (rp1, rp2, rp3), (u11, u12, u13), (u21, u22, u23)$

## 5. Glass-Mackey-type systems.

$$\frac{dx_1}{dt} = \Lambda_1(x_3) - x_1; \quad \frac{dx_2}{dt} = \Lambda_2(x_1) - x_2; \quad \frac{dx_3}{dt} = \Lambda_3(x_2) - x_3.$$

$$\Lambda(w) = aw^m \exp(-bw) \quad \text{Ricker function.}$$

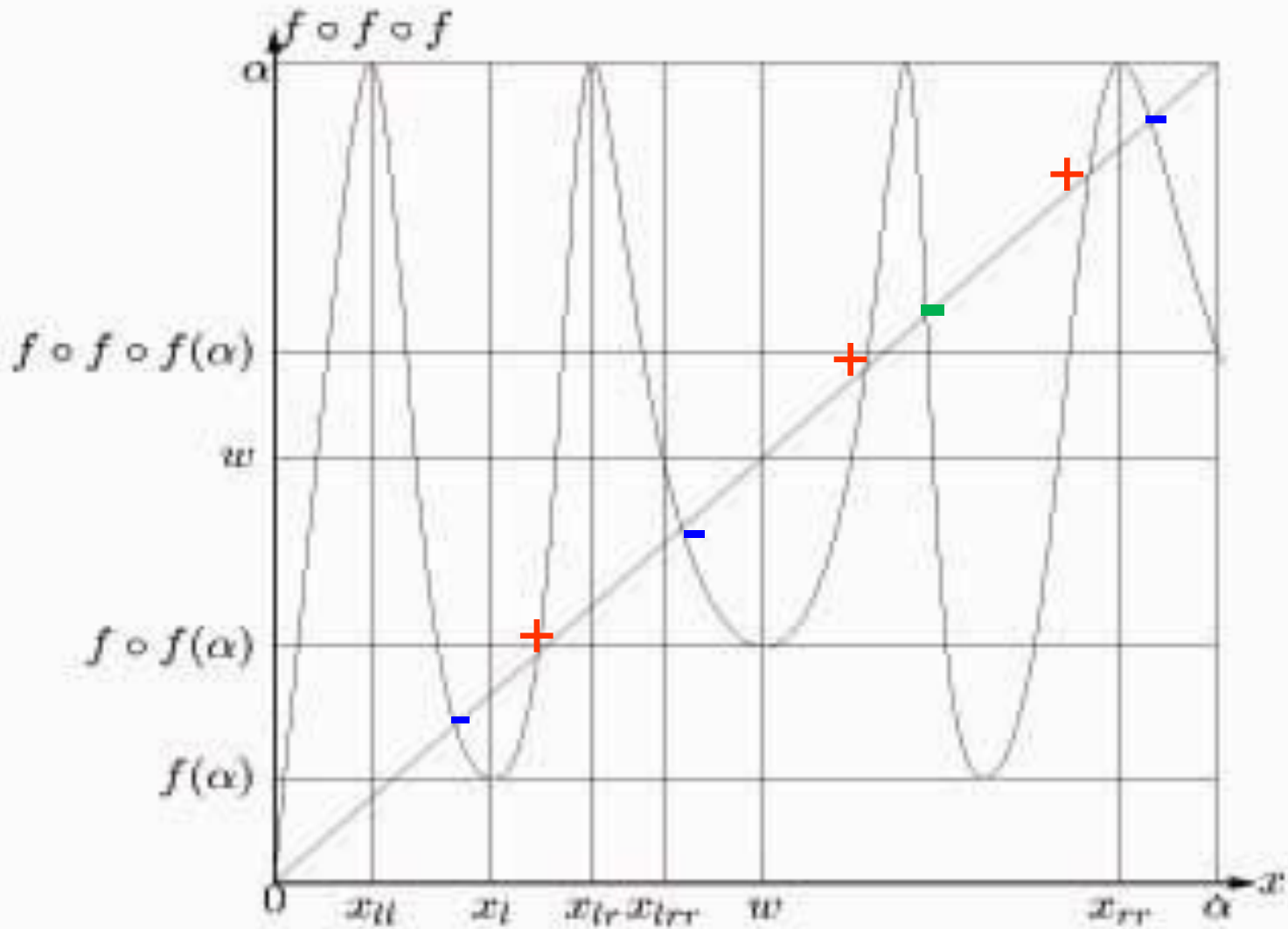
$$\Lambda(w) = \frac{\alpha \cdot w}{1 + w^\gamma} \quad \text{Glass-Mackey function.} \quad (\text{GM})$$

$$\Lambda(w) = r \cdot w \cdot (\alpha - w) \quad \text{Logistic function.} \quad (\text{L})$$

$$\Lambda_{m,q}(w) = \begin{cases} m \cdot w ; w \in [0, \alpha / m], \\ 2\alpha - m \cdot w ; w \in [\alpha / m, (2\alpha - q) / m], \\ q ; (2\alpha - q) / m \leq w. \end{cases} \quad (\Lambda)$$

**Each of the systems listed here has exactly 7 stationary points in some invariant domain  
If the parameters of the system are sufficiently large.**

The origin is also stationary point of each of these systems, but it does not seem to be so interesting.



**Positions of the stationary points of the Glass-Mackey system (GM).**

# Topological indices of the stationary points

**Topological indices of the points marked by “+”**

**equal +1, their Conley indices are :  $h(+)=S^1$  .**

**Topological indices of the points marked by “-”**

**equal -1, their Conley indices are :  $h(-)=S^2$  .**

**The cycles of the Glass-Mackey type systems do appear near the stationary points with negative indices.**

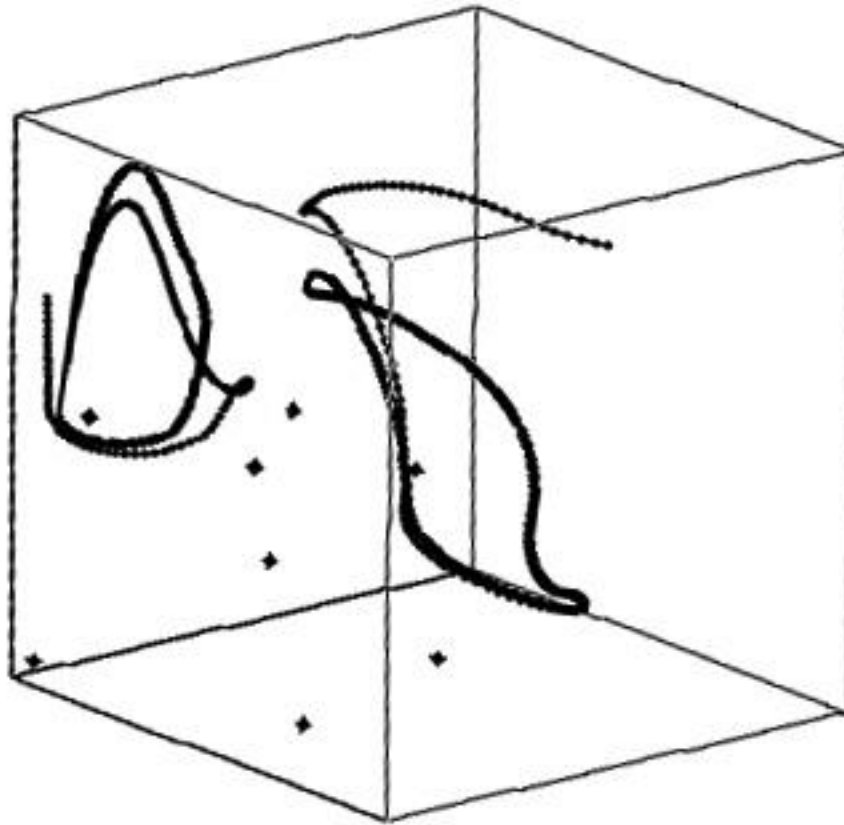
**For the stationary point marked by green minus, we have proved analogs of the theorems 1 and 2 about existence of a (stable) cycle.**

**Numerical experiments show existence of cycles near the 1-st, 3-d and the 7-th stationary points marked by blue minuses.**

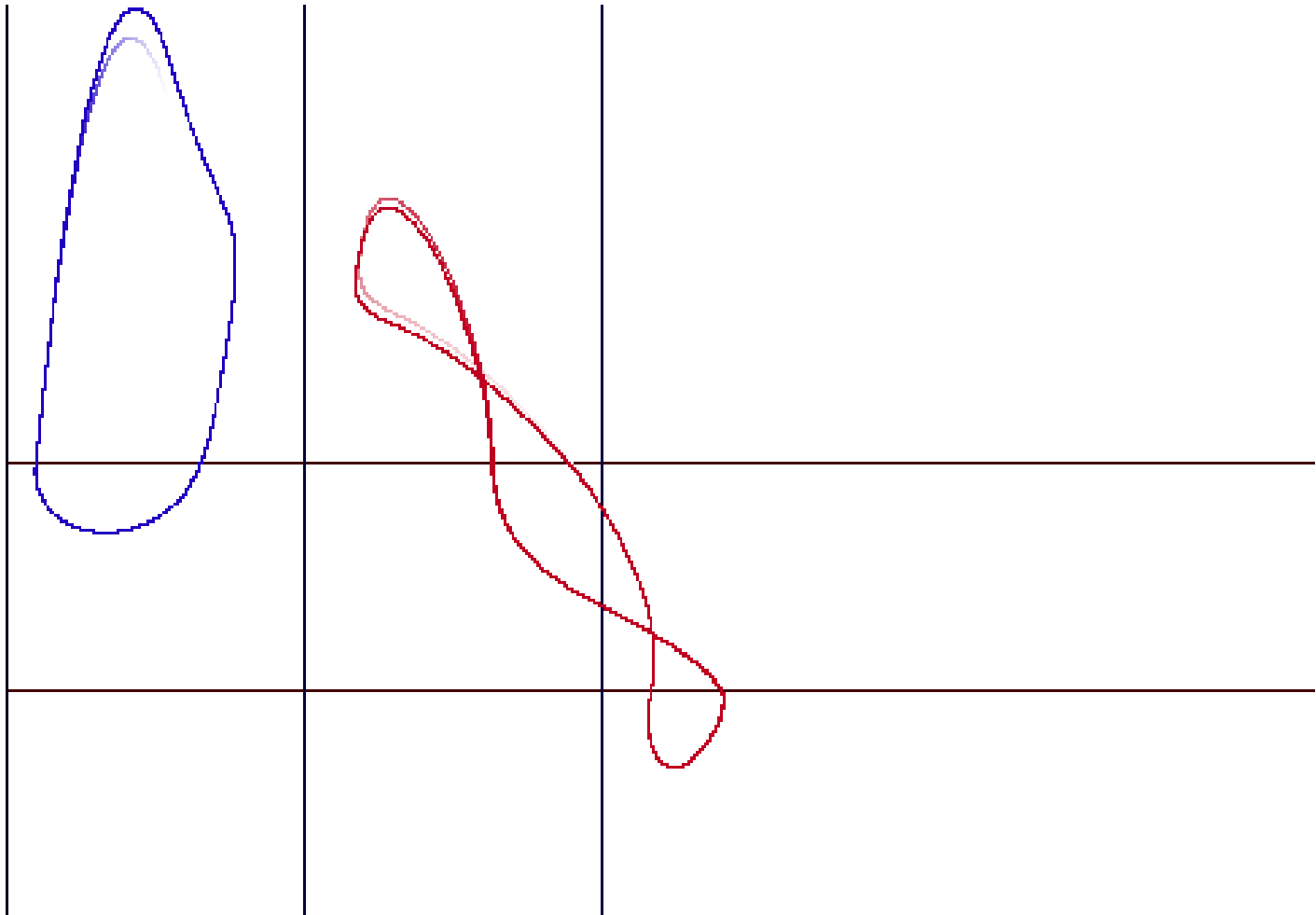


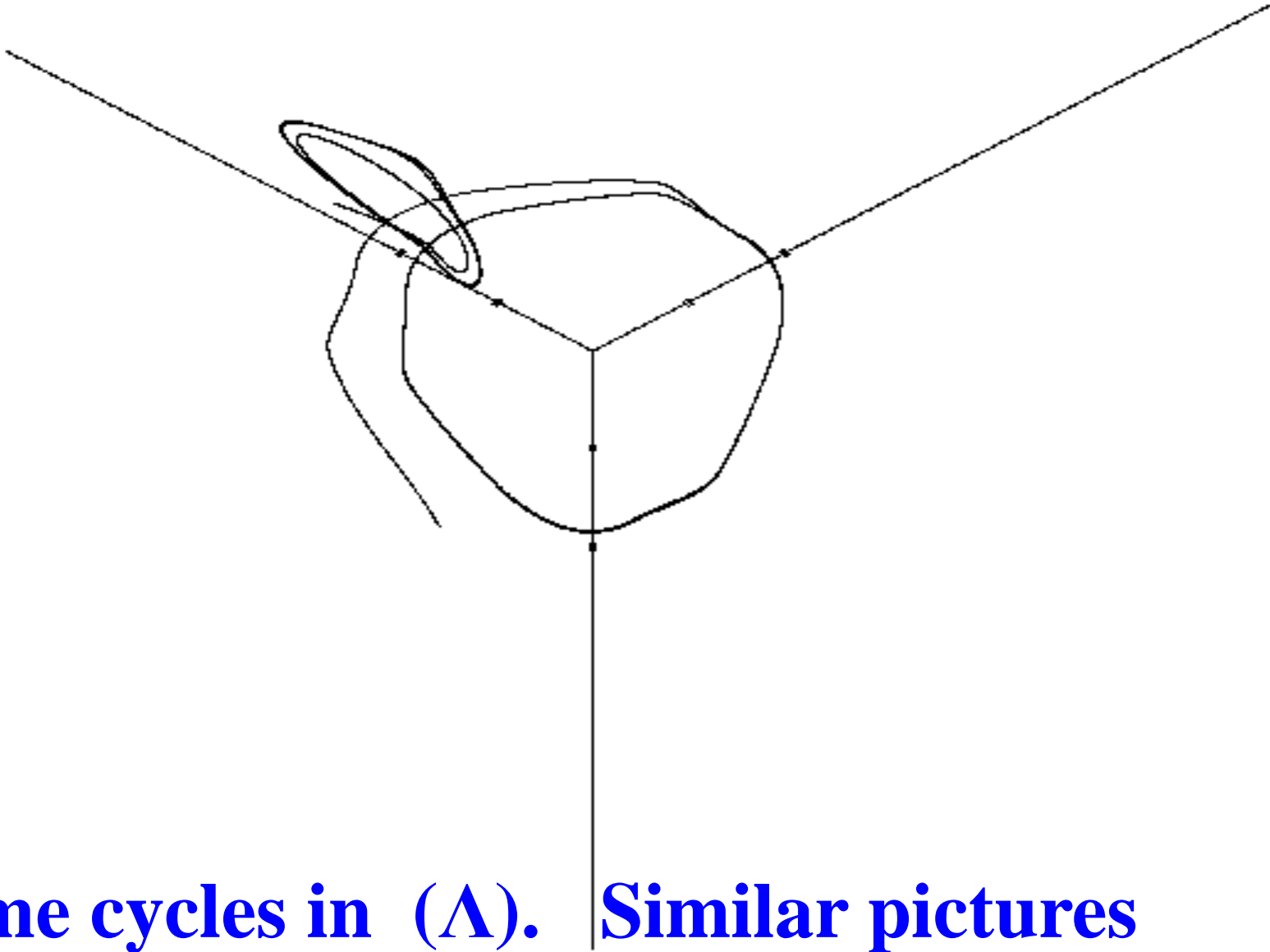
**Cycles**  $C_{\Delta}(V)$ ,  $C_Z(VII)$  **of the system**  $(\Lambda)$ .

$$\alpha = 10, m = 5, q = 0.$$



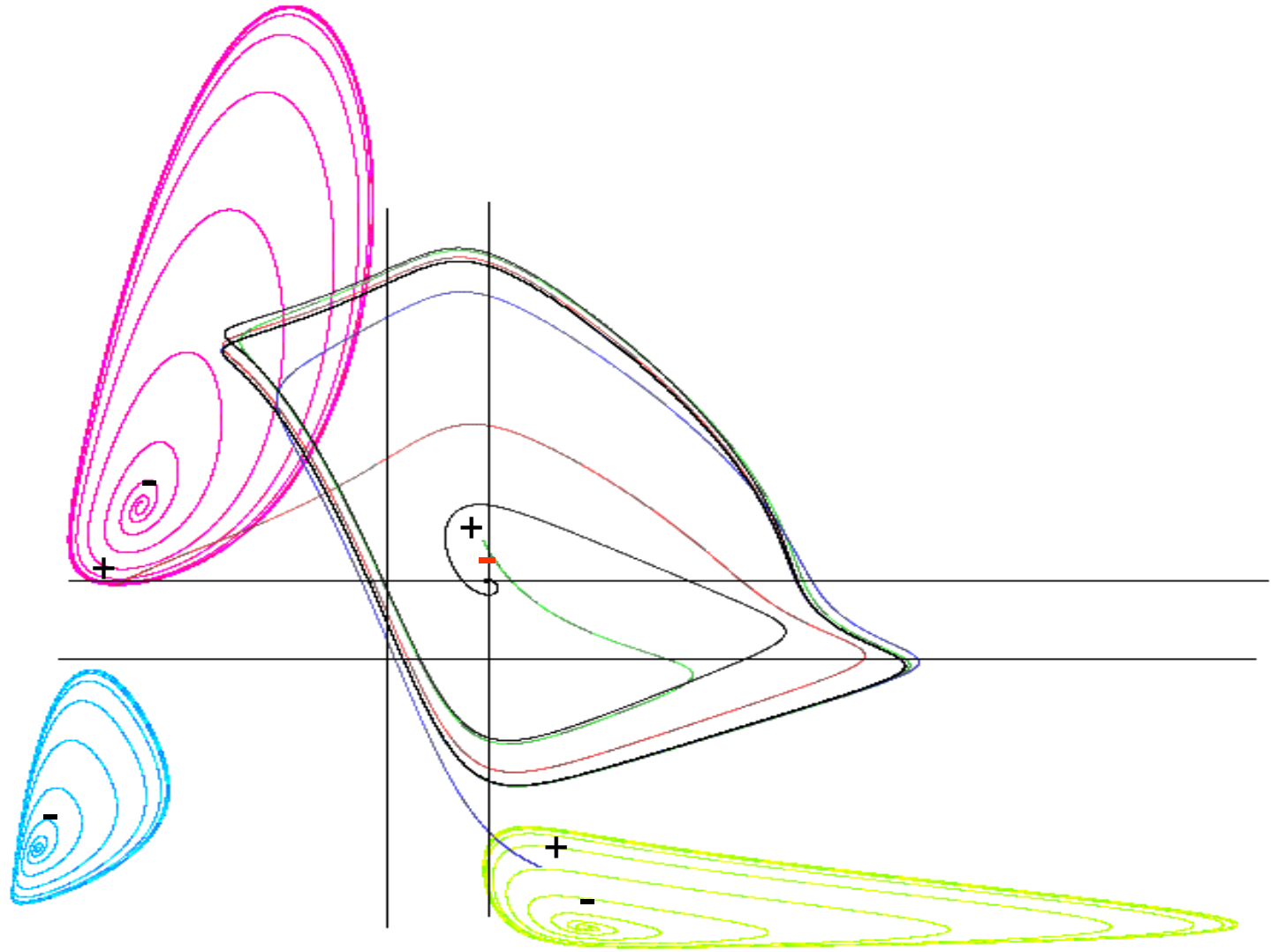
**Same cycles of the system  $(\Lambda)$ .  $\alpha = 10$ ,  $m = 5$ ,  $q = 0$ .**





**Same cycles in  $(\Lambda)$ . Similar pictures were observed in the systems (GM), (L).**

**Cycles**  $C_{\Delta}(V)$ ,  $C_X(I)$ ,  $C_Y(III)$ ,  $C_Z(VII)$  **of the system (GM).**  $\alpha=4.3$ ,  $\gamma=17.25$ . **Projections onto the plane  $Z=0$ .**

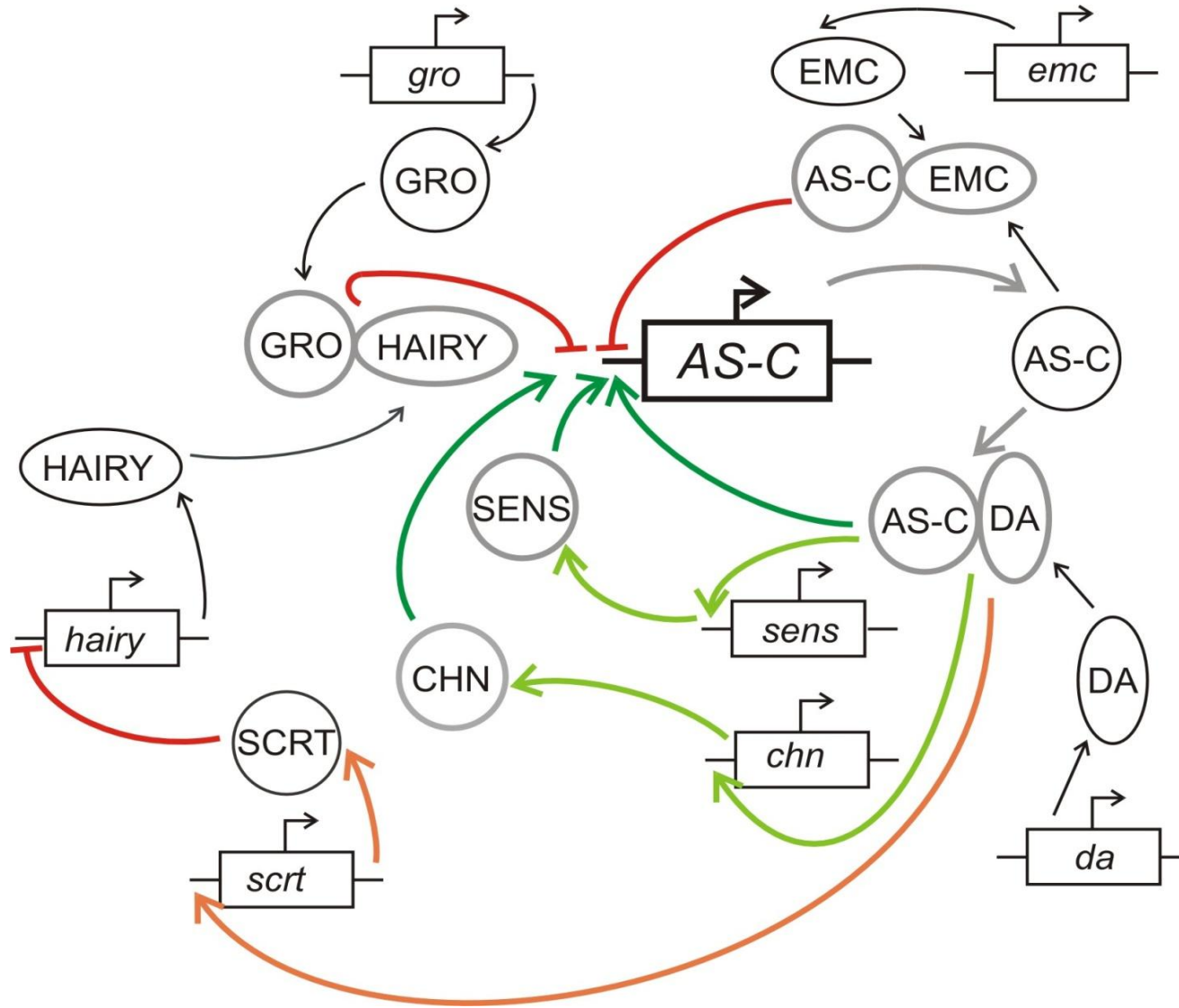


**Our current tasks are connected with:**

- determination of conditions of regular behavior of trajectories;**
- studies of integral manifolds and nonuniqueness of the cycles,**
- bifurcations of the cycles;**
- their dependence on the variations of the parameters, and**
- connections of these models with discrete models of the Gene Networks.**

The Gene Network Determining Development of *Drosophila Melanogaster* Mechanoreceptors.

Comp. Biol.Chemistry, 2009, v.33, pp. 231 – 234.

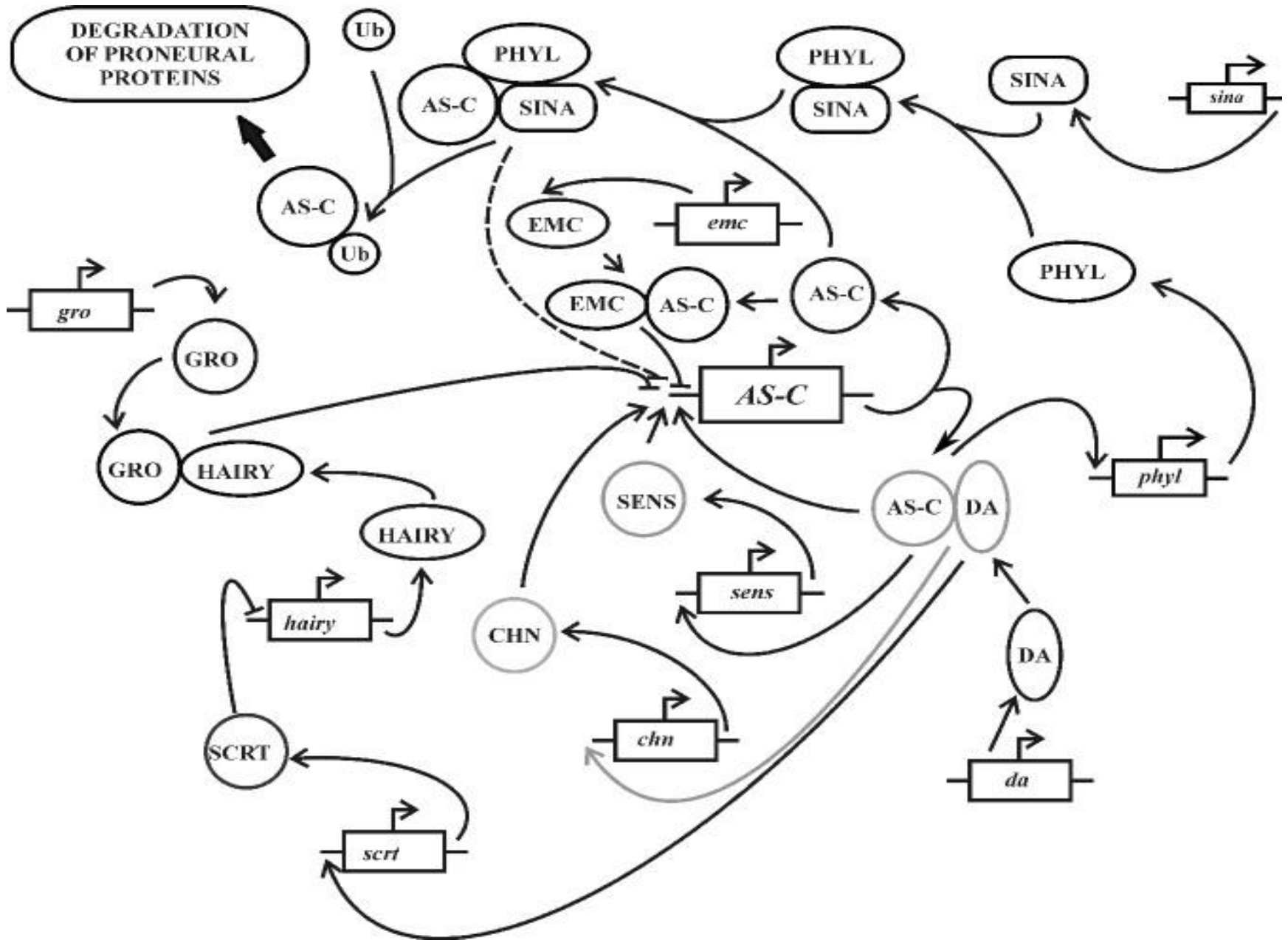


The scheme of the nonlinear system (*DM*), see below.

*CHN=charlatan.*

# More complicated model.

A2



# We study dynamics of the above gene network model.

$x=[AS-C]$ ,  
 $y=[HAIRY]$ ,  
 $z=[SENS]$ ,  
 $u=[SCRT]$ ,  
 $w=[CHN]$   
**concentrations.**

$D=[DA]$ ,  
 $G=[GRO]$ ,  
 $E=[EMC]$   
**parameters.**

**(DM)**

$$\frac{d x}{d t} = F_1(x, y, z, w) - x = \frac{\sigma_1(D \cdot x) + \sigma_3(z) + \sigma_5(w)}{(1 + G \cdot y)(1 + E \cdot x)} - x;$$

$$\frac{d y}{d t} = F_2(u) - y = \frac{C_2}{1 + u} - y;$$

$$\frac{d z}{d t} = S_3(D \cdot x) - z,$$

$$\frac{d u}{d t} = S_4(D \cdot x) - u,$$

$$\frac{d w}{d t} = S_5(D \cdot x) - w.$$

**Sigmoid functions**

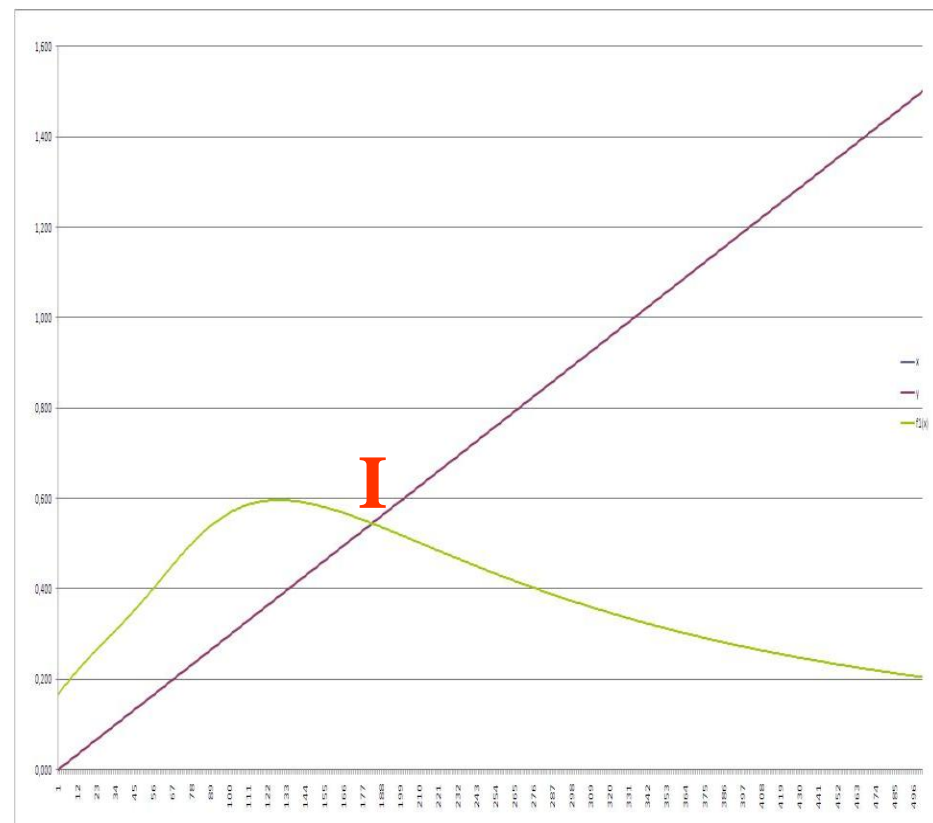
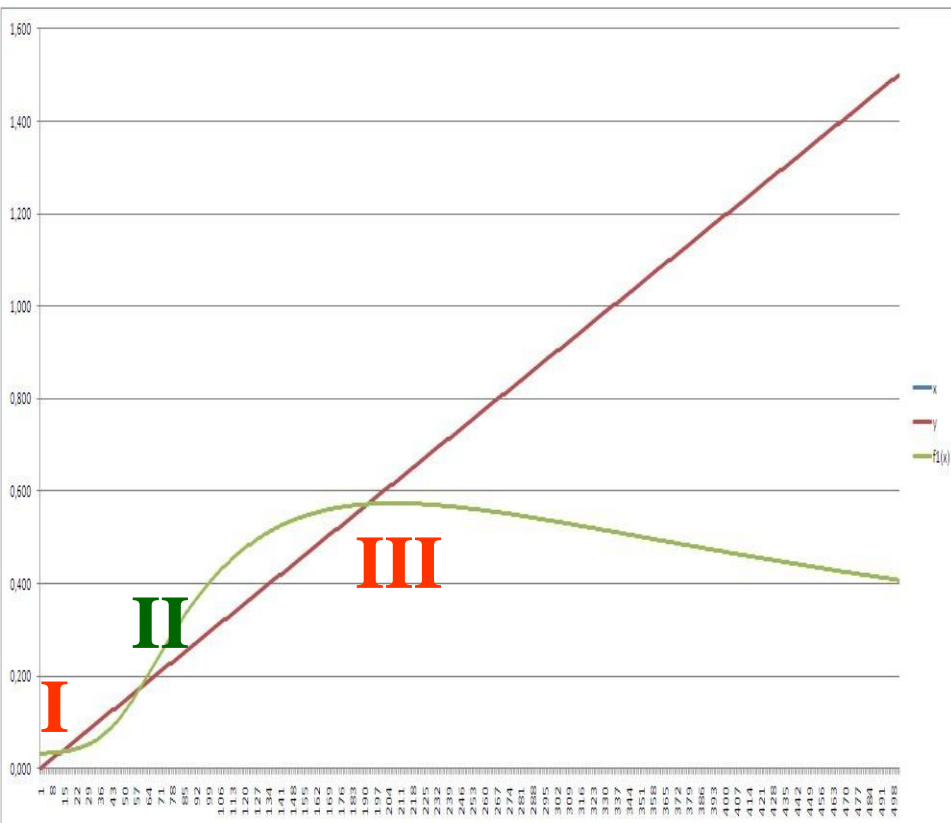
$$S_i(D \cdot x), \quad i = 3, 4, 5; \quad \sigma_j, \quad j = 1, 3, 5$$

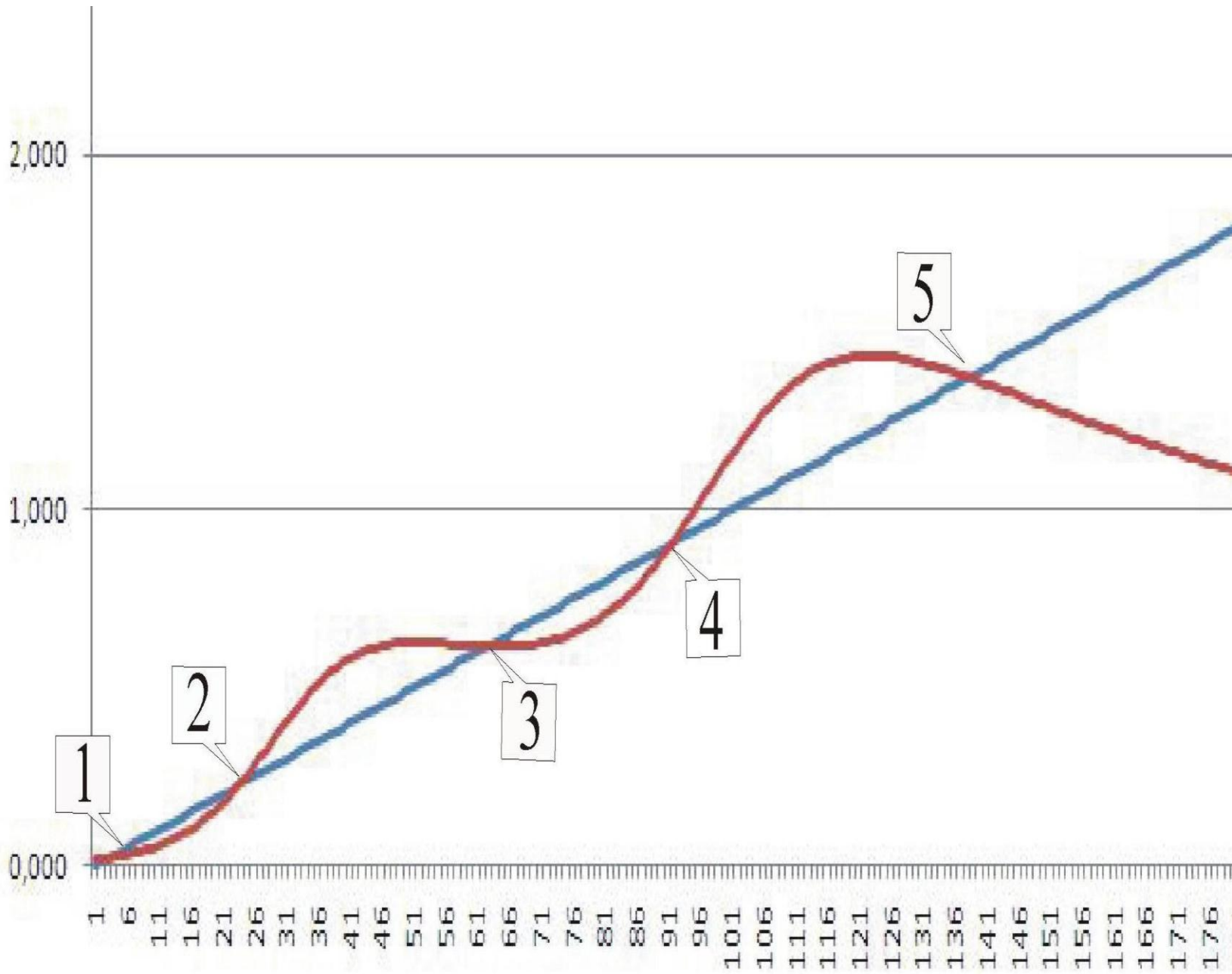
**describe the positive feedbacks on the previous slide.**



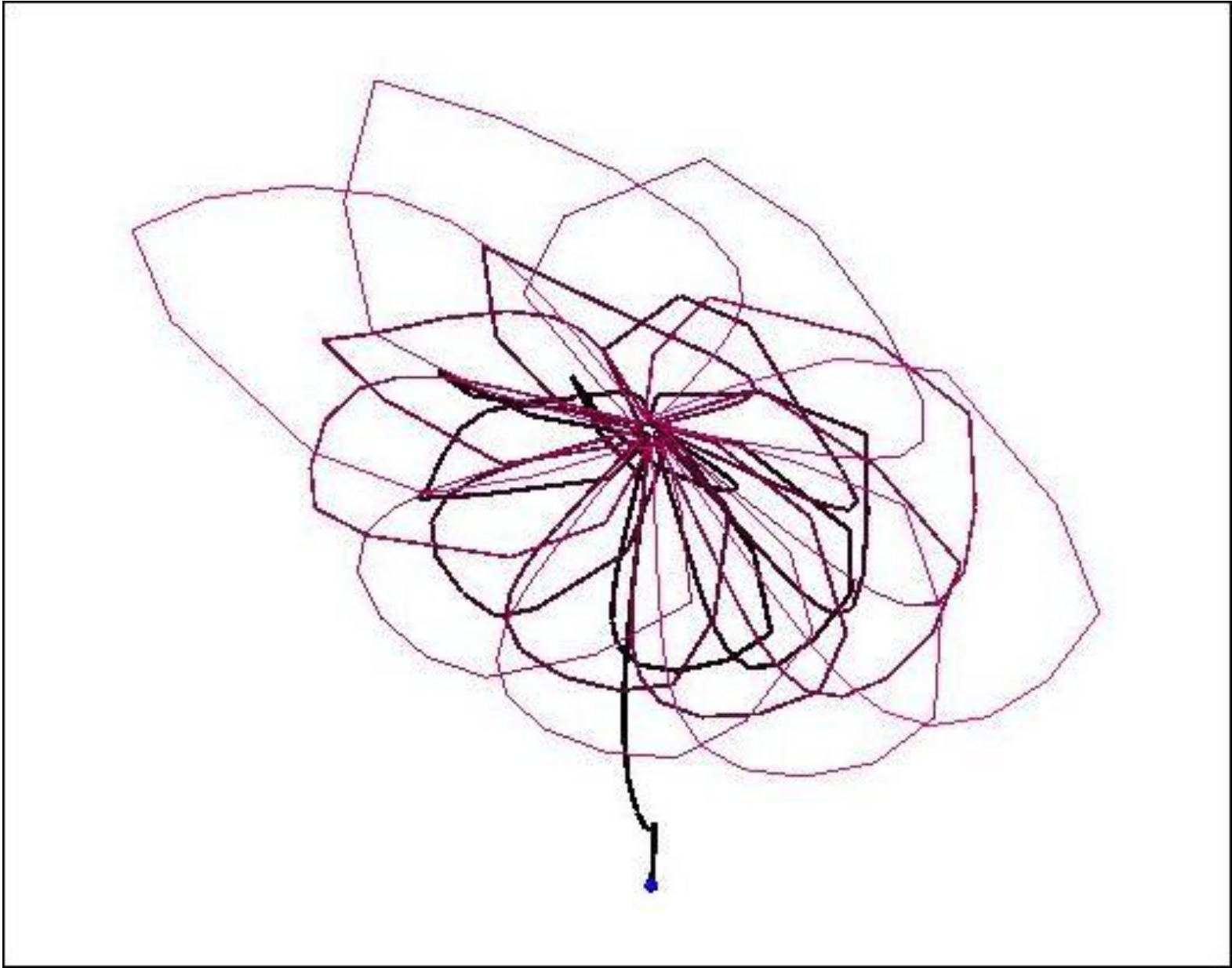
# Graph of $f = R(x) := F_1(x, F_2(S_4(D \cdot x)), S_3(D \cdot x), S_5(D \cdot x))$ and the stationary points of the system ( $DM$ ).

Stationary points “**I**” and “**III**” are stable, the point “**II**” is unstable.  $Ind(\mathbf{I})=ind(\mathbf{III})= -1$ ;  $Ind(\mathbf{II}) = +1$ .

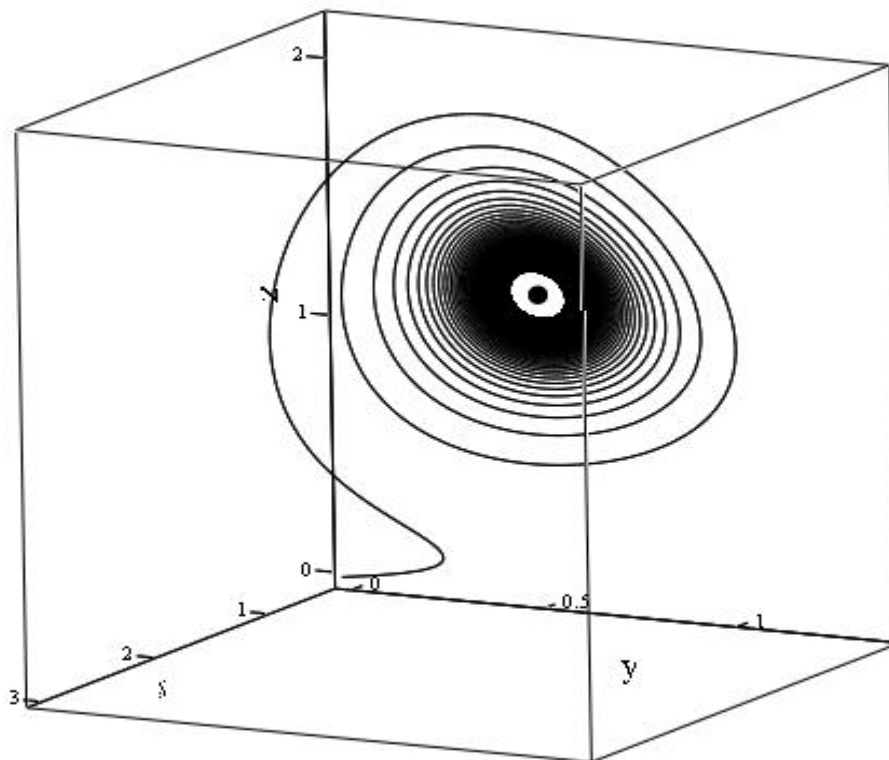




**Thank you for your attention**



$$\frac{dx}{dt} = \frac{\alpha_1}{1+z^3} - x; \quad \frac{dy}{dt} = \frac{9}{1+x^3} - y; \quad \frac{dz}{dt} = \alpha_3 - z(1+y^3);$$



$$\alpha_1 = 8.8$$

$$\alpha_3 = 2.88$$

**A trajectory convergent to the bifurcation cycle.**

(u1, u2, u3), (rp1, rp2, rp3)

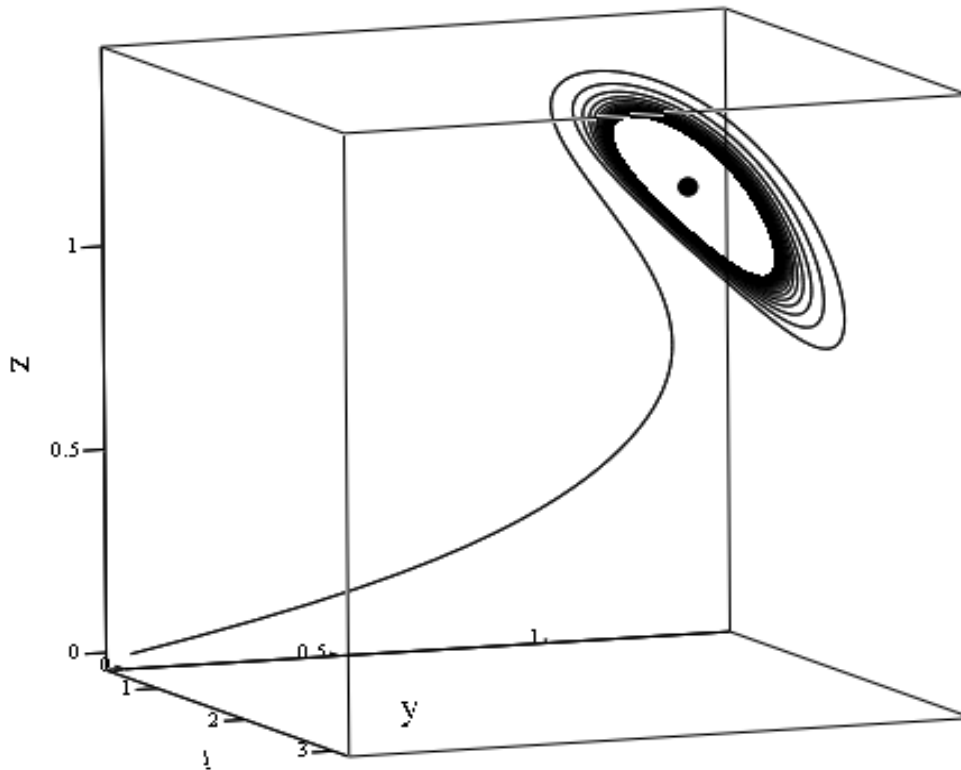
(in cooperation with A.G.Kleshchev)

$$\frac{dx}{dt} = \alpha_1 - x(1 + z^3);$$

$$\frac{dy}{dt} = \frac{9}{1 + x^3} - y;$$

$$\frac{dz}{dt} = \alpha_3 - z(1 + y^3);$$

$$\alpha_1 = 6.15, \alpha_3 = 2.4$$



**A trajectory and a bifurcation cycle.**

# A trajectory and a bifurcation cycle.

