

International R&T Center for Information Technologies and Systems NAS and MES of Ukraine

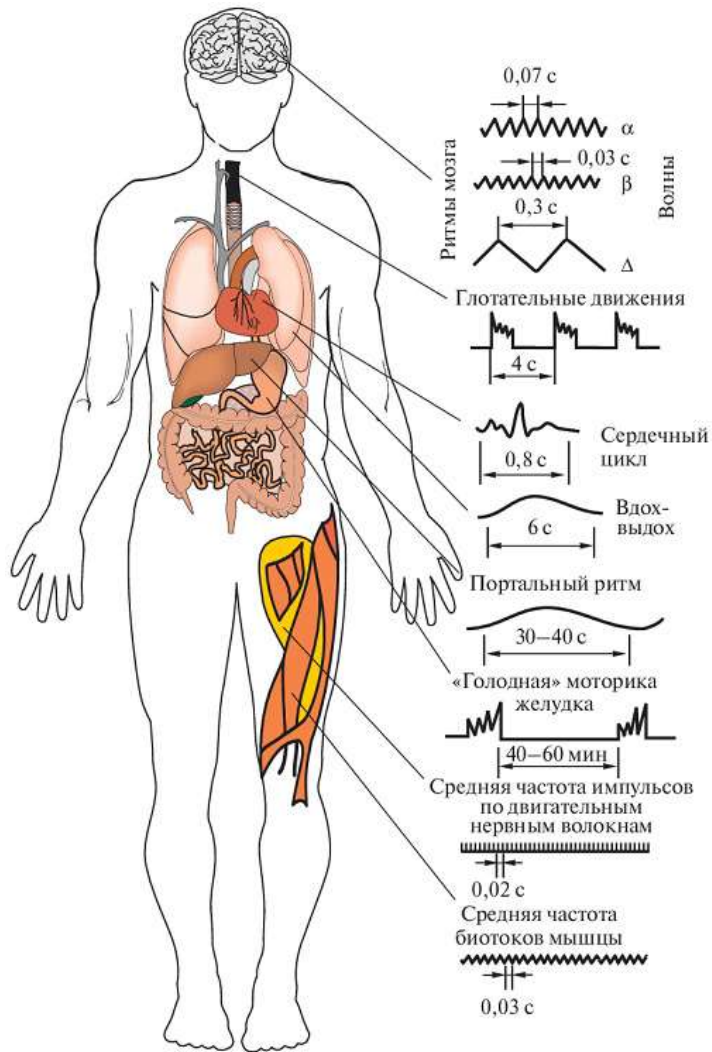
LEONID FAINZILBERG **MATHEMATICAL METHODS FOR** **ANALYSIS AND INTERPRETATION OF** **CLIMATE CYCLICAL PROCESSES**



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Cyclic process in the human body



Rhythmic processes in the brain

Cyclic swallowing movements

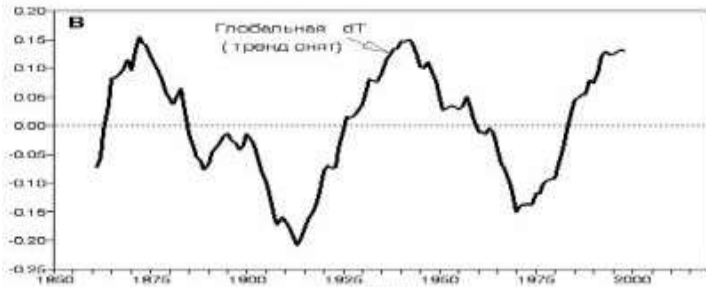
Cyclic processes in the heart

Respiratory rhythms

Hungry gastric motility

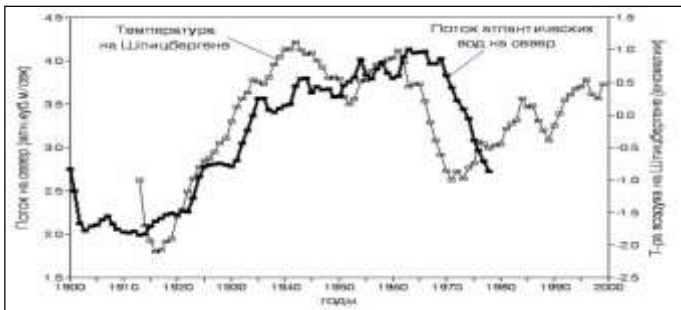
Muscle biorhythms

Cyclic climate changes

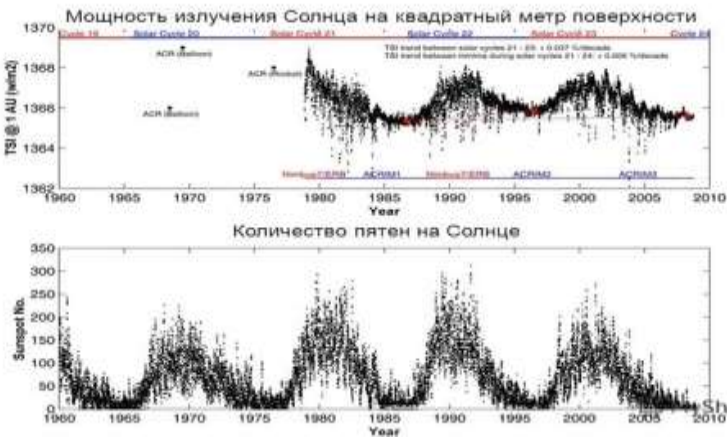


Global temperature anomaly

http://alexeylyubushin.narod.ru/Climate_Changes



Dynamics of Atlantic water discharge



Dynamics of solar activity

<http://www.solar-climate.com/sc/sactivnost.htm>

Basic mathematical model

Observed signal

Unobservable useful signal

$$z(t) = \Phi[z_0(t), \zeta(t)] + h(t)$$

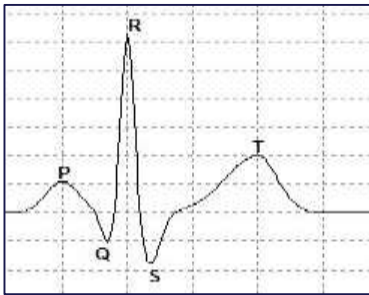
Unknown function

External disturbances

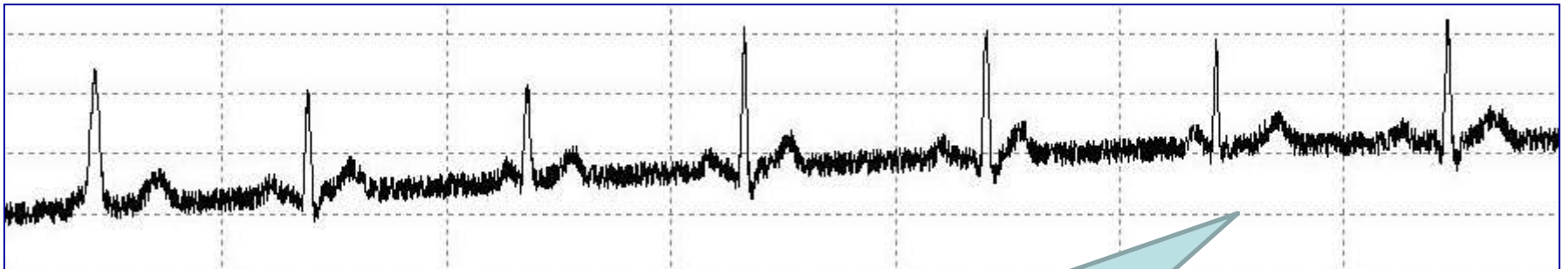
Internal disturbances

Example of a cyclic signal (ECG)

Unobservable useful signal (ECG cycle) $z_0(t)$

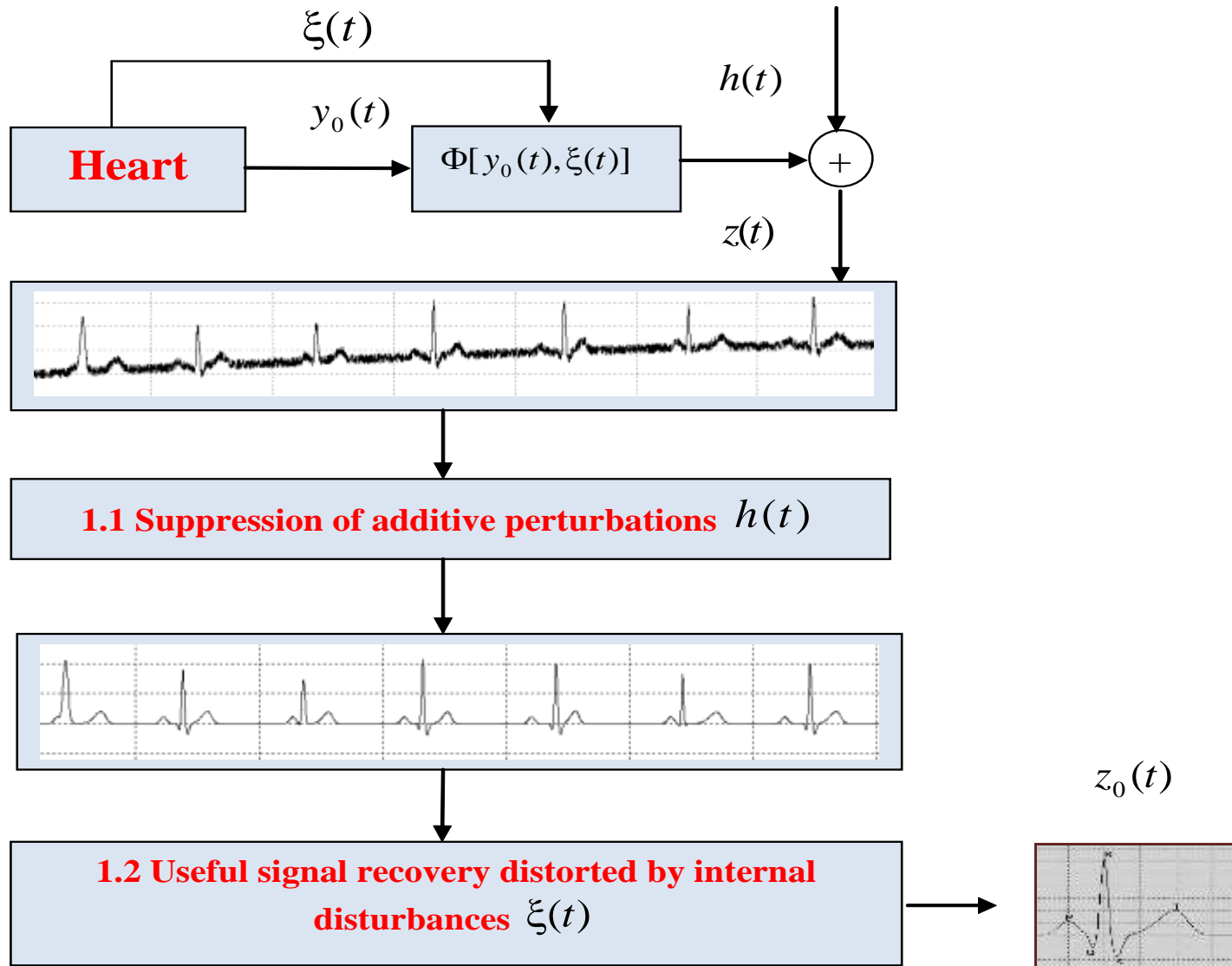


$$z(t) = \Phi[z_0(t), \zeta(t)] + h(t)$$

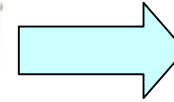
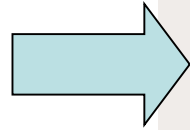


Observed signal (ECG)

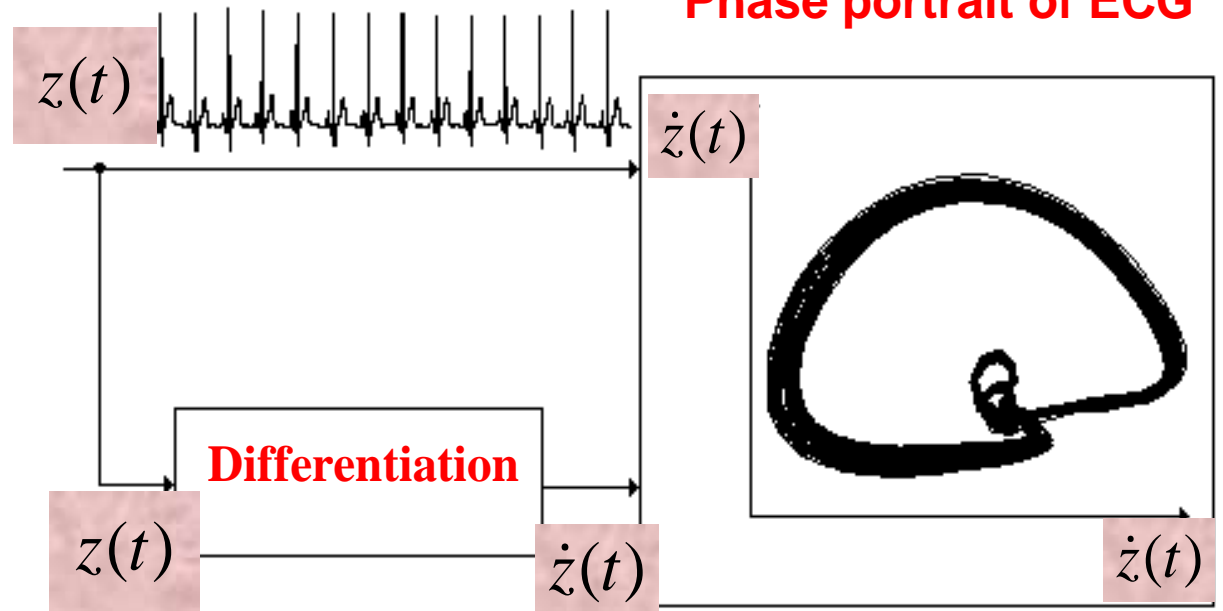
TASK 1: Reconstruct a useful signal from a distorted observation



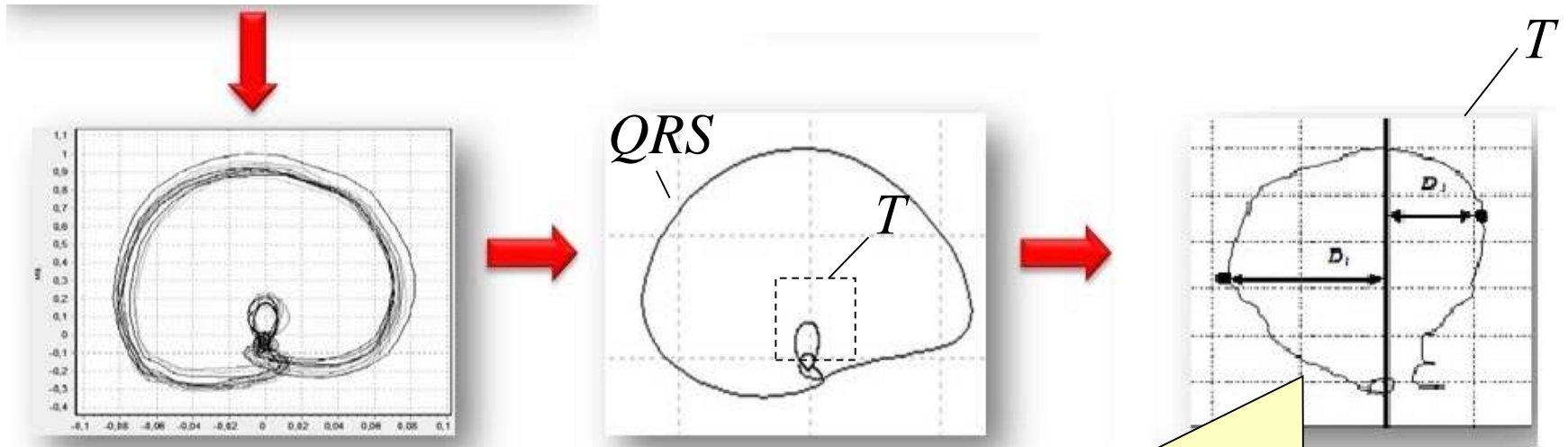
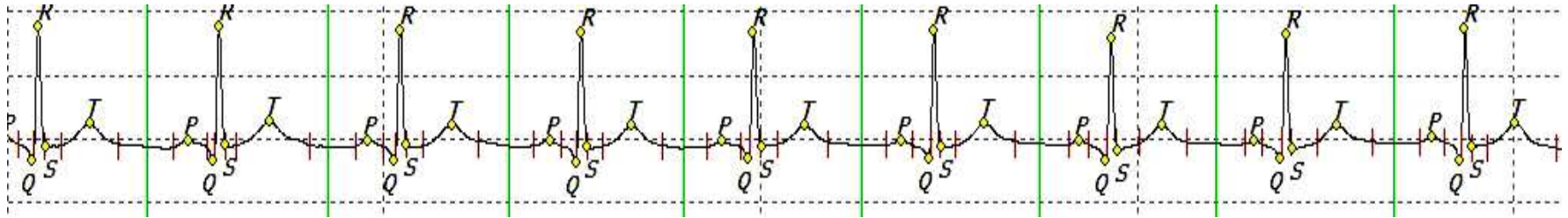
Information technology PHASEGRAPHY



Phase portrait of ECG



Basic idea of IT PHASEGRAPHY



New diagnostic feature

β_T

PHASEGRAPHY implements intelligent signal processing algorithms based on the calculation of the Hausdorff distance

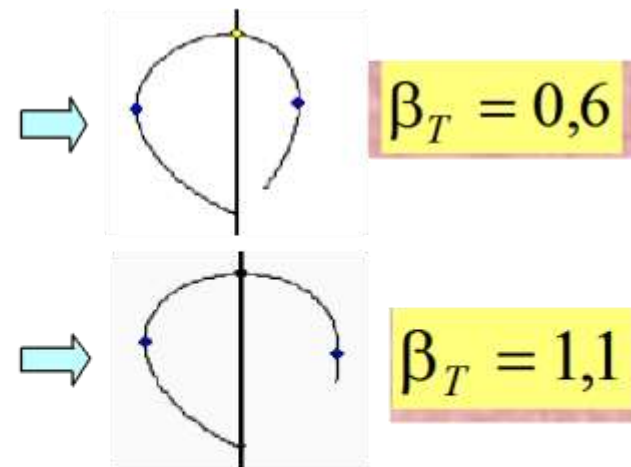
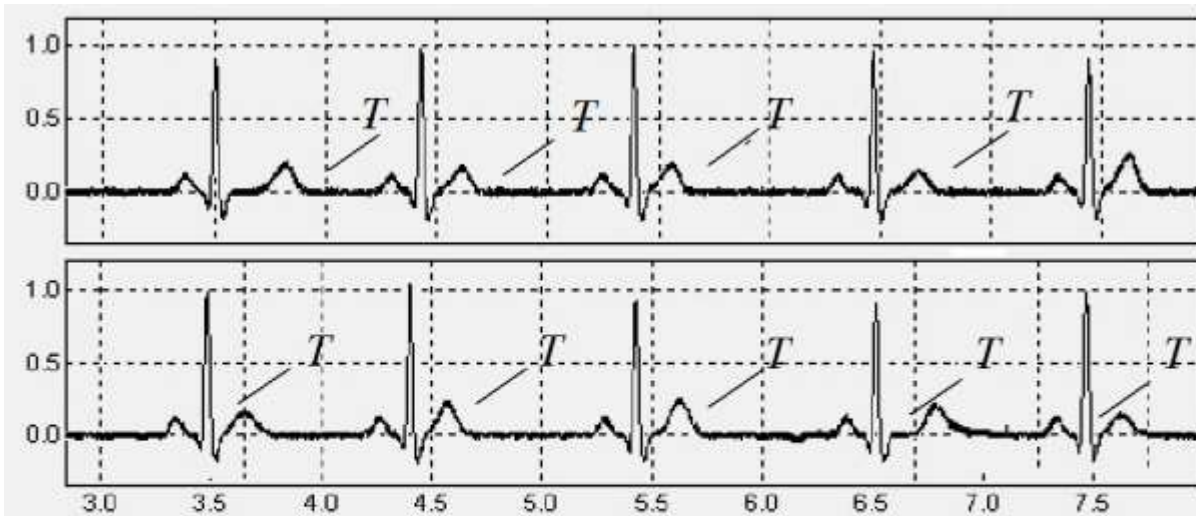
$$R_H(Q_n, Q_m) = \max \left\{ \max_{q_n \in Q_n} \min_{q_m \in Q_m} \rho(q_n, q_m), \max_{q_m \in Q_m} \min_{q_n \in Q_n} \rho(q_n, q_m) \right\}$$

where $\rho(q_n, q_m)$ is the Euclidean distance between the points of the phase trajectories Q_n, Q_m

The row of the Hausdorff distance matrix whose sum of elements is minimal determines the **dominant phase trajectory**

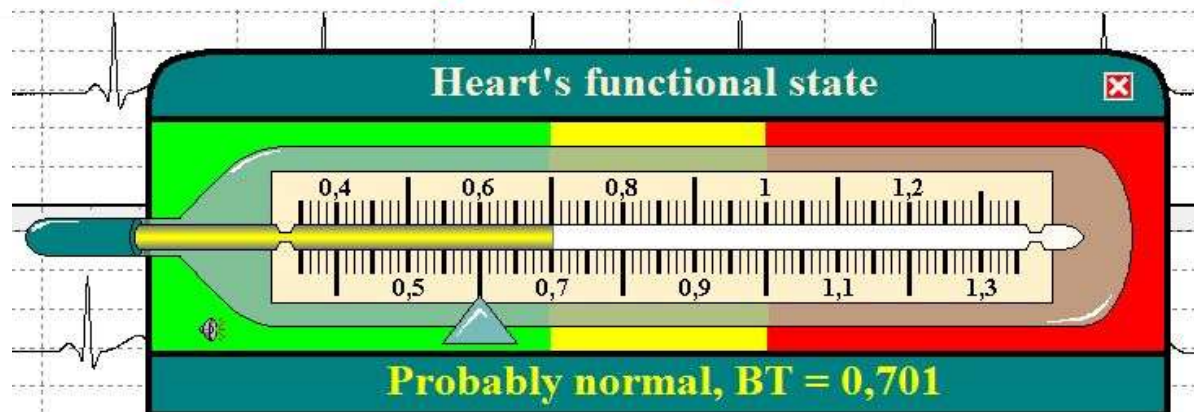
$$Q_0 = \arg \max_{1 \leq n \leq M} \sum_{m=1}^M R_H(Q_n, Q_m)$$

PHASEGRAPHY reveals subtle ECG changes that are invisible with traditional processing

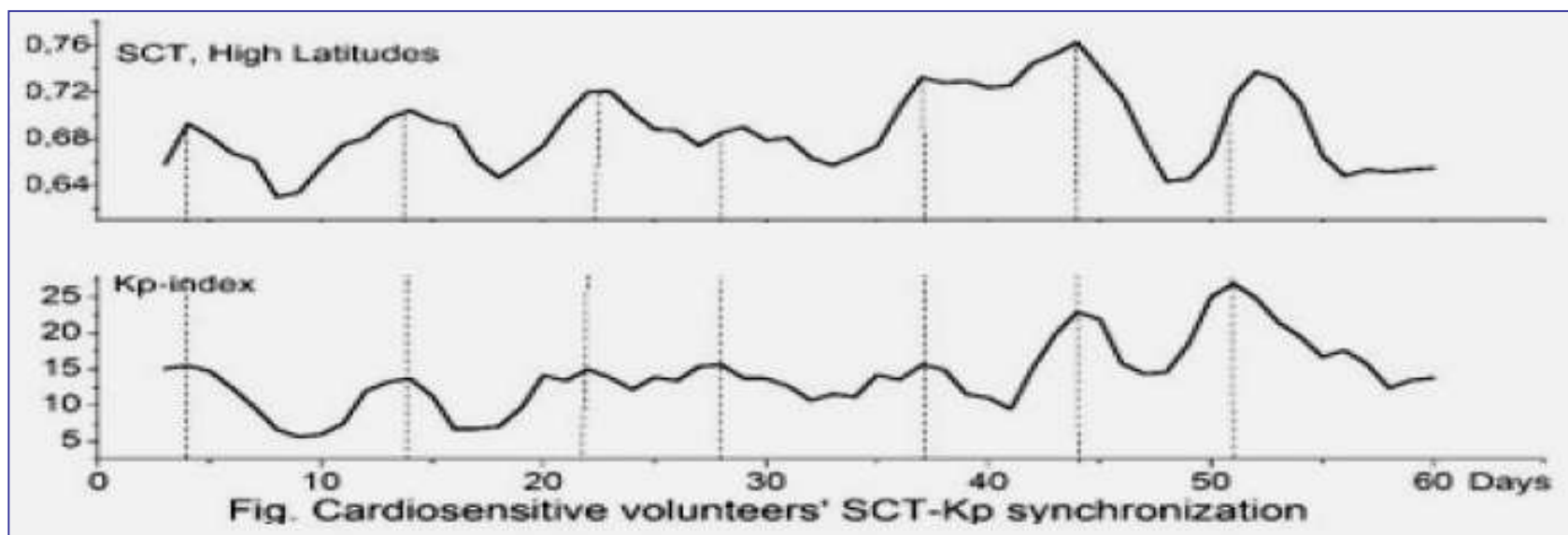


Traditional ECG processing

New feature analysis

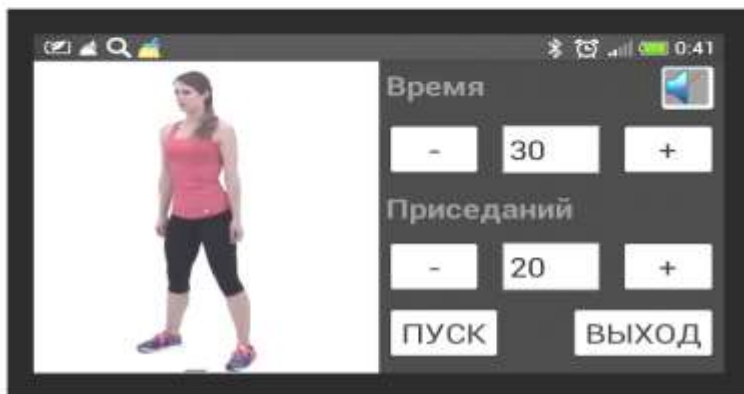
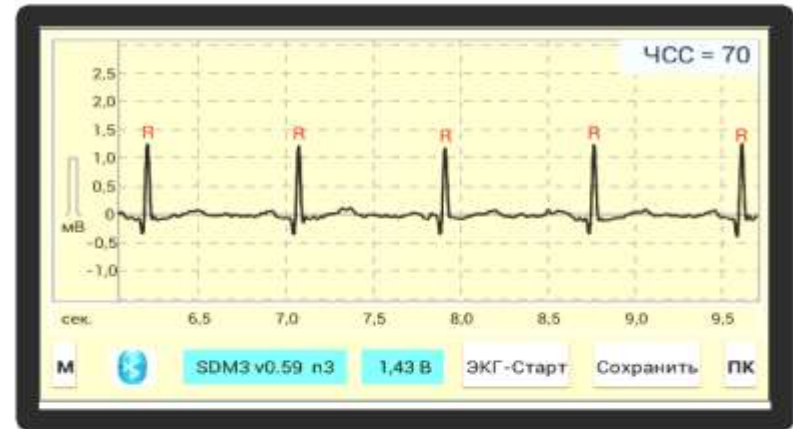


PHASEGRAPHY made it possible to obtain novel scientific results in the Climatology. In particular, **the relationship** between the β_T (T wave symmetry index of ECG phase portrait , **SCT index**) and the global geomagnetic disturbance index (**Kp-index**) was found:

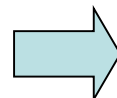
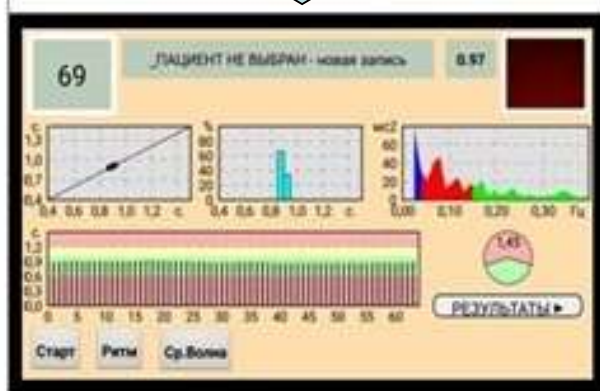
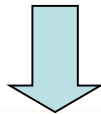
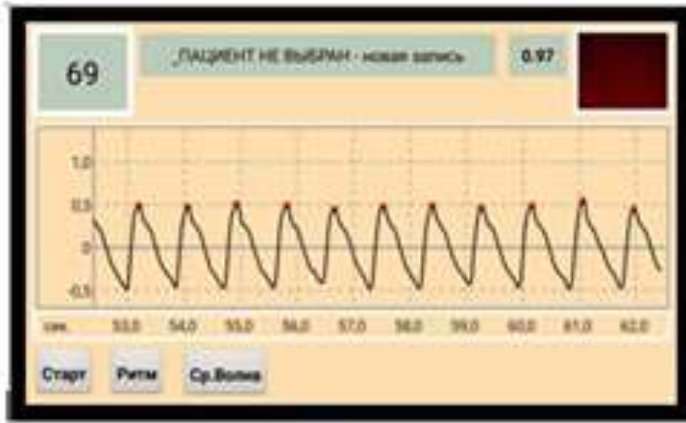


New opportunities of biophysical monitoring in high and middle latitudes for the evaluation of the impact of geomagnetic disturbance on human health . *Revista Turismo: Estudos e Práticas (RTEP/UERN)*
<https://geplat.com/rtep/index.php/tourism/article/view/450/428>

MOBILE PHASEGRAPH ON SMARTPHONE



AI-RITHMOGRAPH



РЕЗУЛЬТАТЫ АНАЛИЗА ВСР :	
Количество кардиоциклов, шт.	106
ЧСС среднее, уд/мин	56
Кардиоцикл (средний), мс	1058
SDNN, мс	55
Индекс напряжения	75,3
CV (коэфф. вариации Пирсона), %	5
LF / HF	2,44

Брадикардия

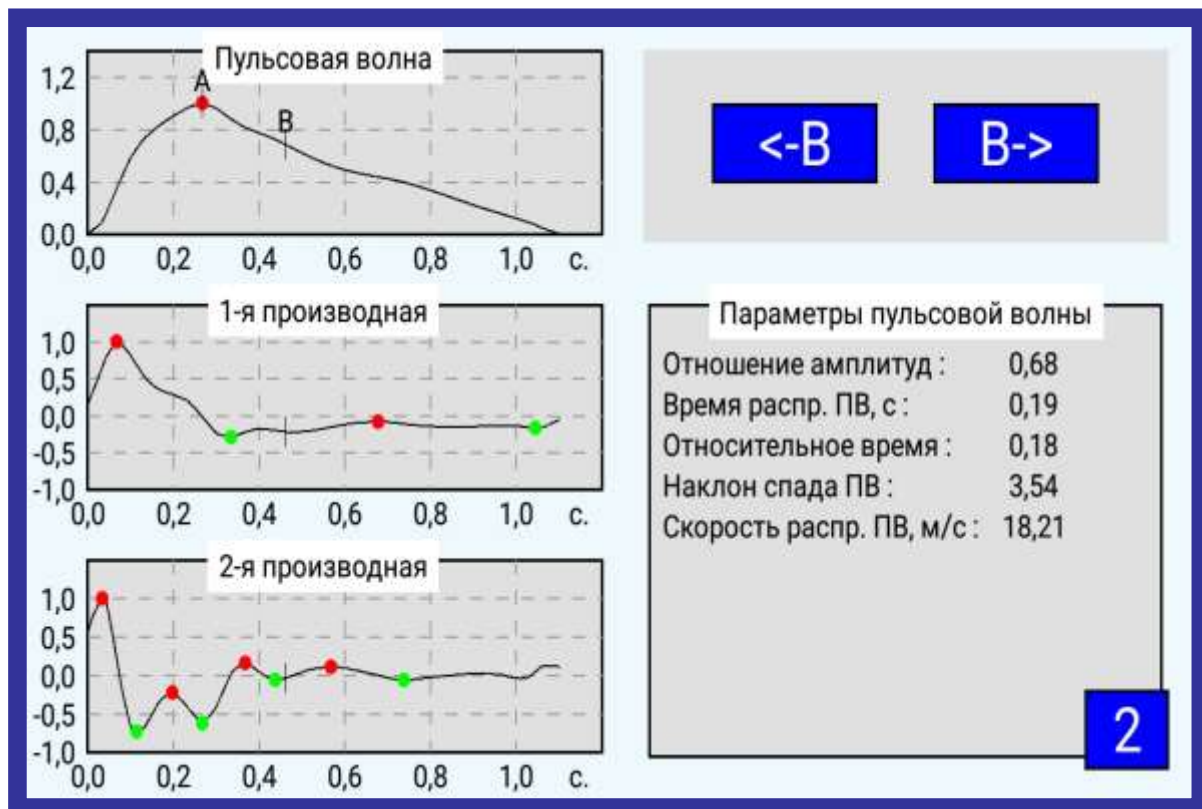
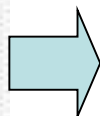
$50 < \text{ЧСС} < 60 \text{ уд.мин.}$

Нормотония

$50 < \text{SDNN} < 70 \text{ мс}$

ASSESSMENT OF ADAPTATION RESERVES FOR HEART RATE VARIABILITY

AI-ARTERIOGRAPH



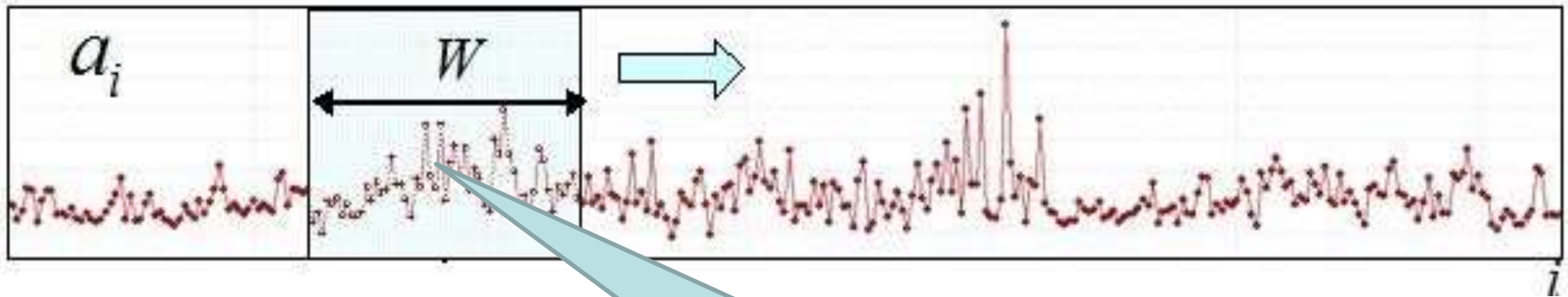
INTEGRALLY CHARACTERIZE OF THE BLOOD VESSELS ELASTICITY

TASK 2. Cyclic signals classification by the dynamics of shape changing

2.1. Phase portrait of a **permutational entropy**

To assess the **dynamics of the cyclic signal**, we will analyze the sequence of parameters that characterize the shape of cycles

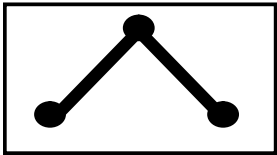
$$A = a_1, a_2, \dots, a_M$$



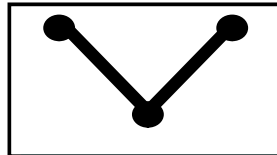
Sliding window

In each window, we will analyze a three-element pattern

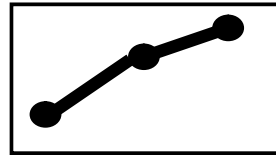
$$a_{i-1}, a_i, a_{i+1}, \quad i = 2, \dots, N - 1$$



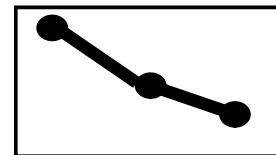
Maximum



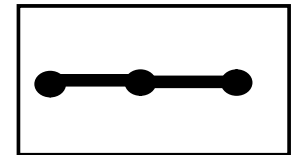
Minimum



Ascending



Descending



Constant

π_1

π_2

π_3

π_4

π_5

Permutational entropy

$$PE = - \sum_{j=1}^5 p(\pi_j) \log_2 p(\pi_j),$$

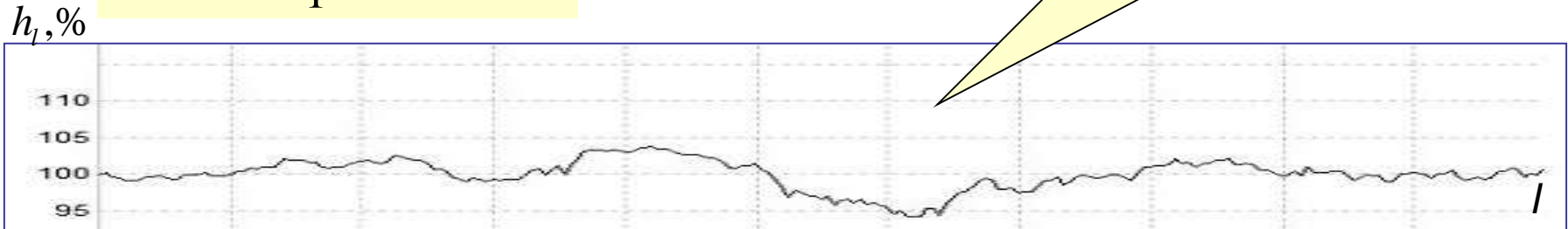
$p(\pi_j)$

- pattern occurrence frequency

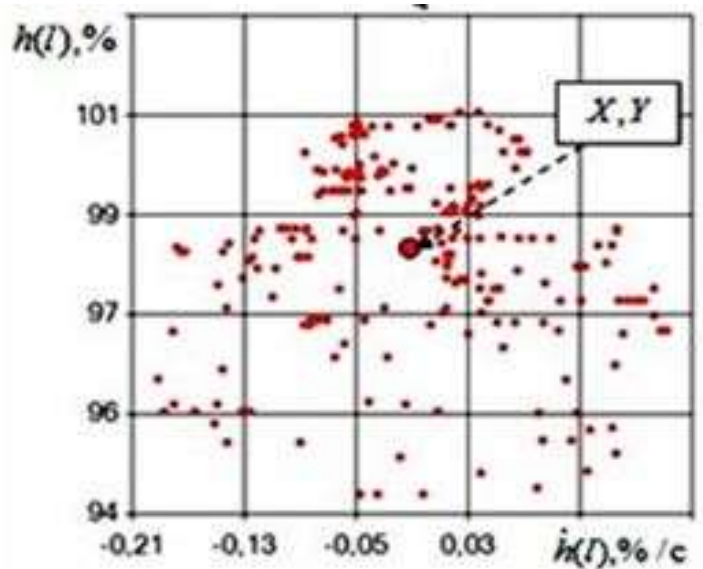
$$h_l = \frac{H_l}{H_1} \cdot 100\%,$$

$$H_1 \neq 0$$

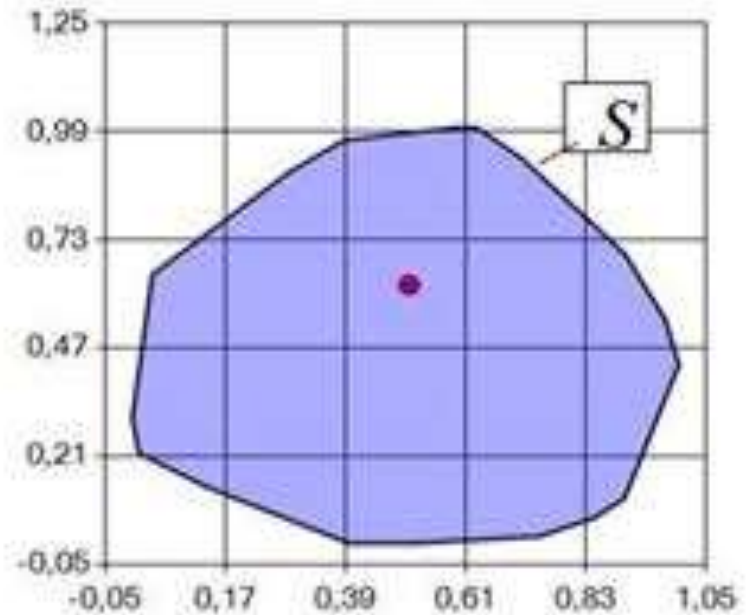
Sliding entropy



Phase portrait of entropy



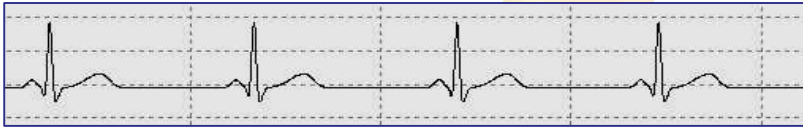
Convex hull



The area of the convex hull is a new diagnostic feature ! 17

2.1. Linguistic approach to classification problem

Syclical signal $z_k(t)$



Chain of characters $\alpha_j \in A$



$$S_k = \alpha_1 \alpha_2 \cdots \alpha_K$$

$$V_n^{(m)} = \begin{cases} +1, & \text{if } x_n^{(m)} - x_{n-1}^{(m)} > \varepsilon, \\ 0, & \text{if } |x_n^{(m)} - x_{n-1}^{(m)}| \leq \varepsilon, \\ -1, & \text{if } x_n^{(m)} - x_{n-1}^{(m)} < -\varepsilon, \end{cases}$$

$$m = 1, \dots, M,$$

$$n = 2, \dots, N_0$$

No	$V_n^{(1)}$	$V_n^{(2)}$	$V_n^{(3)}$	<u>Symbol</u>
	<i>RR-intervals</i>	<i>T-wave symmetries</i>	<i>R-wave amplitudes</i>	$\alpha_n \in A$
0	0	0	0	=
1	0	0	-1	<i>A</i>
2	0	0	+1	<i>B</i>
3	-1	0	0	<i>C</i>
...				
26	+1	+1	+1	<i>Z</i>

The method provides an estimate the proximity between any pair of codegrams S_μ, S_ν based on the **Levenshtein distance** $L(S_\mu, S_\nu)$ which determines the minimum number of editing operations (insertion, deletion and replacement of a character) that provides a transition from S_μ to S_ν

To define the **standards** $S_0^{(1)}, \dots, S_0^{(G)}$ of classes Ψ_1, \dots, Ψ_G we use the formula:

$$S_0^{(g)} = \arg \min_{1 \leq \nu \leq Q_g} \sum_{\mu=1}^{Q_g} L(S_\mu^{(g)}, S_\nu^{(g)})$$

We make decisions about the current signal codegram S_t according to **the rule**

$$\text{CLASS } \Psi_\phi, \text{ if } L(S_t, S_0^{(\phi)}) = \min_{1 \leq g \leq G} L(S_t, S_0^{(g)})$$

CONCLUSION

The successful application of the proposed methods in solving practical problems of biomedical signals processing allows us to hope that, with some refinement, these methods will find application in solving actual problems of climatology.

Thank you for attention!

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