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# **Operation Reliability and Diagnostics of Complex Mechanical Systems**

## *Original scientific paper*

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### **1. Introduction - RDIS**

To identify and characterize a universal scheme of Reliability and Diagnostics Information System (RDIS) for a general solution in the field of mechanical systems is practically impossible. Despite this statement, every information system should contain the following information on the operation of any mechanical system [1] (see Fig. 1), for example:

- − boundary requirements for a system and its elements,
- − list of potential failures, their basic discriminating features, their possible classification (negligible, marginal, critical, catastrophic),

Abstract: This paper deals with the use of an information system for the reliability and diagnostics of complex mechanical systems. It includes a theoretical analysis of relations and interconnection of failures of these systems, providing thus simple but sufficient data (type, rate, failure time distribution and operating mode). It deals in more detail with a correlation of simultaneous failures with the use of a multinomic model. The basic theory is reflected in an example, in which failure of plain bearings in a small set of internal combustion engines (2 sets consisting of 7 engines in a laboratory and in routine operation) were studied and 11 fatigue mechanisms (adhesion, abrasion, erosion, fatigue, vibration, cavitations, mix of the above-mentioned mechanisms, peeling off bearing surface layers, corrosion, change of geometric shape and production, technology and assembly inaccuracies) where 35 basic diagnostic features of failures were discovered. Correlation analysis provided to find important relations between the features of failures (in total, 4 important features in relation to the number of hours worked) and to use them as basic diagnostic parameters in operation.

#### **Pouzdanost rada i dijagnostika kompleksnih mehaničkih sustava**

*Izvornoznanstveni članak*

Sažetak: U ovom radu prikazana je uporaba informacijskog sustava za pouzdanost i dijagnostiku složenih mehaničkih sustava. To uključuje teorijsku analizu odnosa i povezivanje kvarova navedenog sustava, pružajući na taj način malo ali dovoljno podataka (vrsta, odnos, distribuciju vremena kvara i način rada). U radu se detaljnije istražuje korelacija istovremenih kvarova s pomoću multinomnog modela. Osnovna teorija je prikazana u primjeru, u kojem su istraživani kvarovi klizni ležajeva u maloj skupini motora s unutarnjim izgaranjem (2 kompleta koji se sastoje od 7 motora u laboratorijskom i uobičajenom radu) i 11 mehanizama zamora (adhezijsko, abrazijsko, erozijsko, zamorsko, vibracijsko, kavitacijsko, kombinacija navedenih mehanizama, ljuštenje površinskih slojeva ležaja, korozijsko, promjena geometrijskog oblika i proizvodnje, tehnologijska i montažna netočnost), gdje je otkriveno 35 osnovnih dijagnostičkih značajki kvarova. Korelacijska analiza osigurava pronalazak važnih odnosa između značajki kvarova (ukupno, 4 važne značajke u odnosu na broj radnih sati), te ih koristi kao osnovne dijagnostičke parametre u radu.

- − criteria for classification of failures (time flow, scope, conditions for their creation, occurrence in time, mutual relationship, external indications, causes, mechanisms, remedy complexity, qualitative and quantitative features of failures, etc.),
- − diagnostic parameters, used physical methods of diagnostics, methods, methodologies, sensors, diagnostic signals, etc.,
- − determination and characteristics of operating mode (continuous, cyclic, operating, general),
- − technique of failure data collection in time (time protocol, formalized documents, automatic data collection, coding, classification, filtering, security, etc.),



- − methodology and analysis of obtained information (software, routine and special outputs, etc.),
- − additional information or necessary experiments to explain complex outputs,
- − elasticity, effectiveness, integrity, efficiency, compatibility (Microsoft Office, etc.), reliability (ISO 9001), periodical updating, open (modular) design, superstructure availability, departmental solution, etc.
- − utilization of RDIS and feedback, etc.





**Slika 1.** RDIS dijagram

# **2. Failure relationship analysis**

Input information for an analysis of mechanical systems reliability can be presented as a set of vectors  $[2]$ :  $v_i$ ,  $n_v(T)$ ,  $t_{vi}(T)$  and  $r_{vi}$ , for which it is valid

$$
v_i = [v_1, v_2, \dots, v_i, \dots, v_k], \tag{1}
$$

$$
n_{\nu}(T) = [n_{\nu 1}, n_{\nu 2}, ..., n_{\nu i}, ..., n_{\nu k}], \qquad (2)
$$

$$
t_{vi}(T) = [t_{vi}(1), t_{vi}(2), ..., t_{vi}(i), ..., t_{vi}(k)]
$$
\n(3)

$$
r_{vi} = [r_{v1}, r_{v2}, ..., r_{vi}, ..., r_{vk}],
$$
\n(4)

where is:

- *v<sub>i</sub>* …vector indicating a type of failure,
- − *nv(T)* …vector indicating a rate of failures observed in an operating interval <0,T>,
- − *tvi(T)* …vector indicating a time distribution of failure, type  $v_i$  within an interval  $\leq 0, T$ ,
- − *rvi* …characteristic of operating mode.



**Figure 2.**Block diagram of information about failure rate and corrective measures [3]

**Slika 2.** Dijagram toka informacija o učestalosti kvara i korektivne mjere [3]

To analyze data on mechanical systems presented by vectors  $t_{vi}(T)$ ,  $i = 1, 2, ..., n_i$  and  $r_{vi}$ , many standard methodologies of tests and assessment [4] can be used, such as:

- − Wöhler fatigue tests,
- − Weibull fatigue tests,
- − Simultaneous fatigue tests,
- − Censured fatigue tests according to time or samples,
- − Probability models,
- − Probability fatigue curves,
- − Approximative models,
- − Correlation analysis,
- − Testing procedures, etc.

For example, an appropriate method is a belowmentioned correlation analysis related to the vector  $n_v(T)$ , which gives a failure rate identified in the operating interval <0,T>. Let us consider the vector  $n<sub>v</sub>(T)$ , equation (2), which can be written according to a simultaneous occurrence of failures  $(v_i, v_j)$  into the matrix

$$
[n(v_i, v_j)] = \begin{vmatrix} n_{11} & n_{12} & \dots & n_{1j} & \dots & n_{1k} \\ n_{21} & n_{22} & \dots & n_{2j} & \dots & n_{2k} \\ \vdots & \vdots & \dots & \vdots & \vdots \\ n_{i1} & n_{i2} & \dots & n_{ij} & \dots & n_{ik} \\ \vdots & \vdots & \dots & \vdots & \vdots \\ n_{k1} & n_{k2} & \dots & n_{kj} & \dots & n_{kk} \end{vmatrix}, \quad (5)
$$

where diagonal elements  $n_{ii}$  for  $i = 1, 2, ..., k$ , determine a rate of independently occurring failures, type  $v_i$ , and elements  $n_{ij}$  present a simultaneously generated failures [3]. It is valid

$$
\sum_{j=1}^{k} n_{ij} = n_{vi} = n_i
$$
 (6)

$$
\sum_{i=1}^{k} n_{ij} = n_{ij} = n_j \tag{7}
$$

$$
\sum_{i=1}^{k} \sum_{j=1}^{k} n_{ij} = n(T) \tag{8}
$$

where are:

- − the equation (6) … failure rate, type *vi* for *i* = 1, 2, …, *k*,
- − the equation (7) … failure rate, type *vj* for *j* = 1, 2, …, *k*
- $n_{ij} = n(v_i, v_j)$  … failure rate, type  $v_i$  and  $v_j$ produced simultaneously,
- − the equation (8) … number of all failures, type  $v_i$  and  $v_i \cap v_j$ , for *i*,  $j = 1, 2, ..., k$ , within an interval *<0, T>;*

Similarly, we can plot matrixes of simultaneous failures of higher orders [4],

$$
[n(v_i, v_j, v_k)], [n(v_i, v_j, v_k, v_l)] \text{ etc.}, \qquad (9)
$$

which provide information on simultaneous occurrence of failures  $(v_i, v_j, v_k)$ ,  $(v_i, v_j, v_k, v_l)$ , etc.

Independence of failures  $v_i$  is defined by the matrix.

$$
\[n(v_i, v_j, v_k)\] = \begin{vmatrix}\nn_{v1} & 0 & 0 & 0 & 0 & 0 \\
0 & n_{v2} & 0 & 0 & 0 & 0 \\
\vdots & \vdots & \vdots & \ddots & \vdots & \vdots \\
0 & 0 & 0 & n_{vi} & 0 & 0 \\
0 & 0 & 0 & 0 & n_{vk}\n\end{vmatrix}, (10)
$$

In order to get an information analysis from the matrix (5), we rearrange this matrix into the form of relative failure rates

$$
P_j(i) = \frac{n_{ji}}{n_{vi}} \text{ , for } j = 1, 2, ..., k_i \text{ and } i = \text{const.}
$$
 (11)

and we obtain the matrix of relative failure rates, (12)

$$
\begin{bmatrix} p_1(1) & p_2(1) & \dots & p_j(1) & \dots & p_k(1) \\ p_1(2) & P_2(2) & \dots & p_j(2) & \dots & p_k(2) \\ \vdots & \vdots & \vdots & \vdots & \vdots & \vdots \\ p_1(i) & p_2(i) & \dots & p_j(i) & \dots & p_k(i) \\ \vdots & \vdots & \vdots & \vdots & \vdots & \vdots \\ p_1(k) & p_2(k) & \dots & p_j(k) & \dots & p_k(k) \end{bmatrix}
$$

Thus, it will hold

$$
\sum_{j=1}^{k} p_j(i) = \sum_{i=1}^{k} p_j(i) = 1
$$
\n(13)

where  $p_i(i)$  - probability of simultaneous failures  $v_i$  and  $v_i$ .

Evidently, these arrangements will lead us to a more general multinonic model and multinonic distribution [2], which is a generalization of binomic distribution [5]. We are to determine a probability of occurrence generally in a final number of phenomena and we consider *n* independent tests, all of which end just by one from *k* results. Probability of a result  $A_i$  equals to  $\pi_i$ regardless of the order of test, which shall be valid for every  $j, (j = 1, 2, \ldots, k)$ . Nevertheless, we are interested in a number of tests  $n_l$  with a result  $A_l$ , number of tests  $n_2$ , with a result  $A_2$ , number of tests  $n_k$  with a result  $A_k$ . If  $n_1$ ,  $n_2$ ,  $n_k$  are non-negative integer numbers and if it holds that  $\sum_{i} n_i = n$ , then we shall expect  $n_1$ ,  $n_2$ , nk in multinomic distribution with a probability

$$
P(n_1, n_2, ..., n_k) = \frac{n!}{n_1! n_2! ... n_k! (n - \sum_{i=1}^k x_i)!} \pi_1^{n_1} \pi_2^{n_2} ... \pi_k^{n_k} (1 - \sum_{i=1}^k p_i)^{\sum_{i=1}^{n - \sum_{i=1}^k x_i}}
$$
  
...(14).

*i*

The distribution function of multinonic distribution of simultaneous occurrence of various types of failures provides to calculate strength of a possible stochastic dependence between them. For example, for the first row of the matrix (12) it will hold true that for a correlation of failure, type 1  $v_1$  with general *j*-th failure  $v_i$ , the correlation coefficient is

$$
r_{1j} = -\sqrt{\frac{p_1(1).p_i(1)}{[1-p_i(1)][1-p_i(1)]}}, \text{ for } (-1 \le r_{1j} \ge 1).
$$
  
...(15)

In general, it will hold for any failure pair  $(v_i, v_j)$ , the correlation coefficient is

$$
r_{ij} = -\sqrt{\frac{p_i(i).p_j(i)}{[1-p_i(i)][1-p_j(i)]}}, \text{ for } (-1 \leq r_{ij} \geq 1).
$$
  
...(16).

Other potential analysis can refer, for example, to inherent reliability, maintainability and life of subcomponents of complex systems when we are looking for statistic models for  $F_i(t)$ ,  $R_i(t)$  and  $f_i(t)$ , which describe properties of elements or failure mechanism that can be identified from the information system. Conclusions are focused on proposal of preventive measures, maintenance optimization or, in general, on a development of an effective program to assure product quality and reliability, etc.

# **3. Application of monitoring the operation information on failure rate with the use of correlation and regression analysis**

Information system of operation reliability and diagnostics [1] modified in accordance with [4] included a study of operation failures of connecting-rod sliding bearings of the internal combustion engines in special equipment. It referred to 12 connecting-rod bearings, the failures of which were caused by the following 11 wear mechanisms. These are:

- Adhesion, which resulted in tearing out and relocation of particles in the Beilby layer due to a close interaction and local adherence during mutual relative movement, vector  $-v_1$ ,
- − Abrasion (knurling, cutting), which resulted in plastic deformation of unevenness of softer surfaces by hard free particles, vector  $-v_2$ ,
- Erosion resulting in a particle separation and damage (corrugation) of surfaces by foreign particles carried by a flow of lubricating oil, vector  $-\nu_3$ ,
- Fatigue, which resulted in the chipping out of material and pitting during contact, probably cyclic fatigue and high shear stress, vector  $-v_4$ ,
- − Vibrations, which resulted in a separation of particles due to mutual alternating vibration tangential motion, probably due to a small

amount of rigidity in the bearing housing with typical red color of product wear, vector  $-v_5$ ,

- − Cavitation, which resulted in a separation of particles and damage to surfaces in the area of impacts caused by disappearing of cavities during turbulent flow of lubricant through irregular spaces in the bearing, vector  $-v_6$ ,
- Mixture of above-mentioned mechanisms of wear and their mutual interaction together with an influence of the friction corrosion, vector  $-v_7$ ,
- − Peeling off the surface layer of material probably caused by the combustion products and impurities discovered in a lubricant due to insufficient cleaning of air, vector  $-v_8$ ,
- − Corrosion wear or wear caused by a chemical reaction on a working surface (lining) of the bearing with lubricant, vector  $-v_9$ ,
- − Mechanisms of failures caused by changes of geometric shape of working parts during operation (ovality, conicity, etc.), vector  $-v_{10}$ ,
- Mechanisms of failures caused by operating (technological or installation) geometric inaccuracies of the bearing bushing, vector  $-v_{II}$ .

For all mentioned mechanisms, typical characteristics (number, shape and size of wear particles, morphology of wear particle surface and worn bearing, etc.) were determined; standards, gauges and decision criteria for assessment of a technical condition in dependence on performance parameter (number of kilometers covered, number of hours worked Mh, fuel consumed, physical age, etc.) were stated. The result of study was to approximately assess a residual life and prevailing mechanism of wear, vector –  $v_i$  for  $i = 1, 2,..., 11$ . Further solution consisted in identification of 35 basic features  $(Z_1 - Z_3)$ , obtained by diagnostics of engines in view, specification of which can be seen in Tab. 1. Character of these features encompasses an initial (running-in) condition and normal working condition when an inherent reliability is reduced to a level of operating reliability in dependence on the performance parameter  $Z_3$ . Altogether, 14 combustion engines in two sets were studied, especially during an experiment at the testing shop a set  $N_{zk} = 7$  engines and in a routine operation  $N_{\text{prov}} = 7$  engines. Time of operation research  $\langle 0, T_{\text{max}} \rangle$  was measured in machine hours (Mh), for  $T_{max}$  = 4,000 Mh. Diagnostic data on features  $Z_i$  for  $i =$ 1, 2, …, 35 found at engines during research were presented by two groups of information

$$
N_{zk} \dots Z_{ij(k)}^{(0)} \quad \text{and} \tag{17}
$$

 $N_{\text{prov}} \dots Z_{ii(k)}^{(1)}$  , (18)

for 
$$
i = 1, 2, ..., 35
$$
;  $j = 1, 2; k = 1, 2, ..., 7$ ;

Simple correlation analysis of featured pairs resulted in the matrix correlation coefficients [5] in the form

$$
[r(Z_i, Z_j)] = \begin{vmatrix} 1 & r_{12} & \dots & r_{1j} & \dots & r_{1,35} \\ r_{21} & 1 & \dots & r_{2j} & \dots & r_{2,35} \\ \vdots & \vdots & \vdots & \ddots & \vdots & \vdots \\ r_{i1} & r_{i,2} & \dots & r_{ij} & \dots & r_{i,35} \\ \vdots & \vdots & \vdots & \vdots & \vdots & \vdots \\ r_{35,1} & r_{35,2} & \dots & r_{35,j} & \dots & 1 \end{vmatrix} (19)
$$

Testing of hypotheses of correlation coefficients in accordance with relations

$$
H_0 ... r_{ij} = r_{ZiZj} = 0 \text{ and } (20)
$$

$$
H_1 \dots r_{ij} = r_{ZiZj} \neq 0 \tag{21}
$$

In accordance with the decision criteria in the form

$$
\frac{r_{ij}}{\sqrt{1 - r_{ij}^2}} \sqrt{\nu - 2} = t_{\text{výp}}
$$
 (22)

$$
t_{\psi p} \le t_{krit} \implies r_{ij} = 0 \quad \text{a}
$$

$$
t_{\text{vfp}} \rhd t_{\text{krit}} \Rightarrow r_{ij} \neq 0 \tag{24}
$$

for  $t_{krit} = t(a_i; v - 2)$  it was found which of the features is mutually linearly dependent [6]. Correlation coefficient *rij* can be written

$$
r_{ij} = \frac{\sum (Z_{ij} - Z_i)(Z_{ij} - Z_j)}{(v = 1)s_{zi}s_{zj}},
$$
 (25)

**Table 1.** Research of basic features of operating parameters and wear of combustion engine connecting rod bearings [4]

Tablica 1.	Istraživanje osnovnih značajki pogonskih parametara i trošenja ležajeva ojnice kod motora s unutarnjim						
	izgaranjem [4]						



**Table 2.** Significance of correlation of individual features

**Tablica 2.** Značaj korelacije pojedinih značajki



for  $v = 2(N_{lab} + N_{prov})$  and with an estimate of coefficient of determination

$$
d_{ij} = 100r_{ij}^2 \t[%], \t(26)
$$

for *i, j* = 1, 2,..., 35;  $( -1 \le r_{ii} \ge -1 \text{ and } 0 \le d_{ii} \ge 100);$ level of significance  $\alpha = 0.05$ .

# **4. Conclusion**

A further part of research is planned to analyze data by methods of censored selection by time when fatigue tests are specified in instructions, which determine a maximum time of the test at each level of amplitude  $\sigma_i$ . A number  $N_0$ , which determines a maximum number of cycles for testing of every sample, is given in advance. According to these instructions, the fatigue life tests can be divided into two groups:

- − group A, which will cover all values, e.g. fatigue life that did not reach the value  $N_0$ ;
- group B, which will cover, e.g. fatigue life, the value of which we do not know, but we know that they exceed the prescribed value  $N_0$ ;

For an actual given example, cases were analyzed when a time of operation (feature  $Z_3$ ) is significantly stochastically dependent on further features *Zi*. In practice, it was an analysis of features  $(Z_3, Z_i)$  for  $i = 7$ , 8, 10, 23, at which an important correlation dependency was observed, in the following order

$$
\{Z_3 \leftrightarrow Z_8\} \quad \dots \quad r_{38} = 0.87; \qquad d_{38} = 76\%
$$
  

$$
\{Z_3 \leftrightarrow Z_7\} \quad \dots \quad r_{37} = 0.69; \qquad d_{37} = 48\%
$$
  

$$
\{Z_3 \leftrightarrow Z_{23}\} \quad \dots \quad r_{323} = 0.68; \qquad d_{323} = 46\%
$$

$$
\{Z_3 \leftrightarrow Z_{10}\} \ldots \qquad r_{310} = 0.61; \qquad d_{310} = 37\%
$$

for which information (*i* = 3, 7, 8, 10, 23; *υ* = 1, 2, … , 28) that were obtained from information system of operating reliability and diagnostics are the basis for a more detailed creative analysis of failure rate and diagnostics of objects tested. These will be the following close relations:

- Time of operation smooth wear of the center of sliding surfaces,
- − Time of operation smooth wear of the edges of sliding surfaces,
- Time of operation friction corrosion of external surfaces,
- Time of operation stains on sliding surfaces;

The result of research provides important information that enable optimizing the operating diagnostics of objects tested (internal combustion engines) based on five important diagnostic parameters.

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