METHOD OF IDENTIFICATION OF NONLINEAR DYNAMIC CONTROL OBJECTS OF PREPARATORY PROCESSES BEFORE ORE DRESSING

**Purpose.** To develop a method for identifying mathematical models of control objects as a part of an adaptive management system for preparatory processes before ore processing.

**Methodology.** The methodological ground of the research is the classic position and the fundamental works by foreign and domestic scholars, statistics, and the results of authors’ research. Methods of fuzzy set theory, comparative analysis of abstraction, and generalization of scientific experience of modern theoretical research studies, systematic and comprehensive approach are applied in the study. The effective operation of industrial technological complexes characteristic of the mining and processing industry involves solving a wide range of operational automatic control tasks.

**Findings.** Technological processes of reducing material coarseness such as crushing, grinding are the most resource-intensive operations of the mining and processing industry. Therefore, the use of the most effective systems of operational management of these processes is essential in modern conditions of operation of a mining and processing enterprise. A methodological approach to assessing the parameters of the linear parts of the control object model from the input parameters and the correspondence of the process values at the output of the control object are proposed. The analysis made it possible to determine and implement a management system for ore-shelling mills at an industrial enterprise.

**Originality.** For the first time, the study proposes to solve the main problems of identifying the corresponding structure of a real object and the structure of a model, determining the nonlinear static characteristics of an object. This allows one to create effective systems with a fairly universal method for identifying the control object.

**Practical value.** The method is distinguished by high rate of selection of information about an object. It allows determining the parameters of the linear parts and the structure of the nonlinear part of the model. The identification method described in the article was tested when developing and implementing control systems for ore-peeling mills IWG 55 × 75 at SevGOK MPP.

**Keywords:** identification method, nonlinear and non-stationary control object, adaptive systems, mining and processing integrated plant

**Introduction.** Crushing and grinding are widely spread technical processes for ore processing [1]. That is why effective operation control of these processes is a vital task. However, there are essential difficulties in solving this problem, since crushers and drum mills are considered nonlinear and non-stationary control objects, which are characterized by the substantial time response. Moreover, useful information signals about these control objects are exposed to high frequency noises. In such conditions, it is expedient to apply adaptive control systems. State-of-the-art means of information processing and control provide implementation of control algorithms practically of any degree of difficulty in real time scale, and the main challenge in performing adaptive control is to meet the conditions of quasi-stationarity.

Given these considerations, identification method of preparatory processes control should meet the following requirements:

1. provide high rate of selecting operation information about an object;
2. have versatile features as regards to the object structure;
3. take into consideration nonlinear elements as a part of the object;
4. exhibit characteristics of weak-signal sensitivity to interference actions.

**Literature review.** Effective exploitation of industrial and technical complexes typical for mining and processing industry involves solutions of a wide range of automatic operation control tasks, wherein identification of dynamic non-stationary control objects is one of them.

Many classic works are concerned with solving this task, among which are those written by P. Eykhoff, A. Sage, L. A. Rastrigin, D. Grop, N. S. Raibman and others. Though, all the calculating procedures described in the works are based on strict limitations performing of which in practical conditions of processing mills are considered impossible [2].

Many known engineering methods such as processing of acceleration curve-fitting are oriented on the linear models of low order. As to non-parametric models such as patch models [3] or neuron nets [4], being versatile in the sense of their structure, they demand significant time for adjusting, which makes them of low use for identification inertial non-stationary objects [5]. At the same time, it is known that crushing and grinding facilities as controlled objects are considered nonlinear, non-stationary and highly inertial objects [6]. That is why in such conditions successful solving of identification tasks is possible on the basis of merging strict mathematical methods of information processing with engineering approaches to forming initial data that has brought to the approach described in this paper [7].

**Problem description.** A mathematical model of an object for the definite control channel (e.g. for a drum mill, self-grinding for channel “speed of a feeder belt – active power of a driving motor”) is given as the following scheme (Fig. 1).

In the scheme: \( W_1(a_1, a_2, ..., a_n) \) is a linear operator dependent on \( n \) parameters \( a_1, a_2, ..., a_n \), demonstrating inertial characteristics of the performing mechanism and the object; \( \varphi (x) \) is a nonlinear chain without inertia; \( W_2(b_1, b_2, ..., b_m) \) is a linear operator dependent on the parameters \( b_1, b_2, ..., b_m \) and demonstrating inertial characteristics of the control object, channels of gathering and transmitting information. It is assumed that the order of linear operators \( W_1 \) and \( W_2 \) is known.

When performing processes \( u(t) \) and \( z(t) \) on object input and output given in the interval \( 0 + T \), it is required to identify parameters of linear parts \( a_i = 1, m \); \( b_k = 1, m \) and the form of nonlinear function \( \varphi (x) \).

**Solution procedure.** The principle which forms the basis for solving the task set, is that parameters of linear parts of the
model $a_i, l = \overline{1, m}$, $b_k, k = \overline{1, m}$ should have the values whereas the same values of process $x(t)$ correspond to the same values of process $y(t)$. For the given values of the parameters $a_i, l = \overline{1, m}$, $b_k, k = \overline{1, m}$, processes $x(t)$ and $y(t)$ can be obtained by transformations of known $u(t)$ and $z(t)$, i.e.

$$x(t) = W_1'(a_i, a_2, ..., a_k) \cdot u(t); \quad y(t) = W_2'(b_k, b_2, ..., b_{k_2}) \cdot z(t).$$

After discrete time sampling, the degree of correspondence of the values of processes $x(t)$ and $y(t)$ can be done with the help of sample correlation ratio $\eta_{xy}$. Thus, the solution of the task of identification reduces to optimization problem

$$\eta_{xy} \rightarrow \max_{a_i, b_k} \quad (1)$$

It is required to identify such values of parameters $a_i, l = \overline{1, m}$, $b_k, k = \overline{1, m}$ that sampling correlation ratio $\eta_{xy}$ will reach its maximum.

**Problem solving.** Before solving the problem (1), stated references of implementation of the processes $u(t), z(t)$ given within the interval $0 \leq T$ have the form of discrete equidistant reports $u_i, z_i, i = 1, p$ with time-based step $\Delta t = T/p$, and operating range of change of process $x(t)$ is divided into $S$ intervals (groups) with step $h = (x_{\text{max}} - x_{\text{min}})/S$. Let us set $x_j = j = 1, S$ as a midpoint of the $j$th interval, where $j$ is an interval (group) number.

Then, the problem of identification is solved following the given algorithm:

1. Some initial values of the parameters $a_i, l = \overline{1, m}$, $b_k, k = \overline{1, m}$ are set.
2. The process of transformation of discrete process $u_i$ is done by operator $W_1$:

$$x_i = W_1'(a_1, a_2, ..., a_k) \cdot u_i, \quad i = 1, p.$$  

3. Inverse transformation of discrete process $z_i$ is done by operator $W_2^{-1}$:

$$y_i = W_2^{-1}(b_1, b_2, ..., b_k) \cdot z_i, \quad i = 1, p.$$  

4. Obtained massif $y_i, i = 1, p$, is divided into $S$ groups which correspond to the intervals $x_j, j = 1, S$.

5. For each $j$th group ($j = 1, S$), a group mean $\bar{y}_j$ and dispersion $D_j$ are calculated.

6. Intergroup, general dispersion and sampling correlation ratio $\eta_{xy}$ are calculated.

7. Calculations according to points 2–6 are repeated for each new values of parameters $a_i, l = \overline{1, m}$, $b_k, k = \overline{1, m}$ until for a certain optimal set of parameters $a_1', a_1', ..., a_k'$, $b_1', b_2', ..., b_{k_2}'$, the maximum value of sampling correlation ratio $\eta_{xy}$ has been obtained.

The obtained optimal values of parameters $a_1', a_1', ..., a_k'$, $b_1', b_2', ..., b_{k_2}'$, which provide maximum $\eta_{xy}$, will be the result of identification. Besides, correlation of class marks $x_j, j = 1, S$, and group mean $\bar{y}_j, j = 1, S$, with optimal values $a_1', a_1', ..., a_k'$, $b_1', b_2', ..., b_{k_2}'$, is considered an estimate of non-linear static characteristic $y = \varphi(x)$ (Fig. 1).

The process of finding parameters $a_1, a_2, ..., a_k, b_1, b_2, ..., b_n$ is carried out by one of the optimization methods (for example, by the method of descent in coordinates, and when the amount of parameters is small, by the method of simple search).

It is obvious that when performing the identification procedure, there is a need to provide adequate variability of the input action on object $u(t)$, preferably throughout the whole operating range of its change.

Besides, process $u(t)$ in the interval $0 \leq T$ should contain the repeated value of the input action, for example, as given in Fig. 2, a.

Otherwise, as given in Fig. 2, b, as an example, the problem will have a set of solutions since for any parameter set $a_1, a_2, ..., a_k, b_1, b_2, ..., b_n$ an intergroup dispersion will be close to zero, and selective correlation ratio – close to 1. If there is any possibility to change the input action purposefully in the whole operating range, then the method can be activated by reducing time interval $0 < T$ (Fig. 2, b).

Fig. 3 demonstrates the scheme of the simulation experiment aimed at evaluating response of the described identification method to high frequency interferences being active at the output of an object.

To be specific, control object (CO) was a series connection of linear relaxation chains with transmitting functions

$$W_1'(p) = (a.p^2 + a.p + 1)^{-1}, \quad W_2(p) = (b.p + 1)^{-1},$$

and with static characteristics $y = c_0 x^2 + c_1 x + c_0$. Action $u(t)$, which corresponds to Fig. 2, b, was applied to CO input. Interference action $f(t)$ was imitated on CO output. Therein, centered stable process $j(t)$ had high frequency (relative to the
object’s own frequency) broadband spectrum and saleable mean square deviation. As a result of the identification in accordance with the described algorithm, values of parameters \( a_1, a_2, b_1 \) were evaluated. Correspondent estimates are designated as \( \hat{a}_1, \hat{a}_2, \hat{b}_1 \).

The dependence of parameter evaluation error \( \delta = |\hat{a}_1 - a_1|, |\hat{a}_2 - a_2|, |\hat{b}_1 - b_1| \) on a mean square deviation of interference \( \sigma_0 \) obtained as a result of the experiment is given in Fig. 4. Herein, \( \sigma_0 \) which characterizes interference intensity is calibrated as a percentage of the whole range of changes \( z(t) \) in the monitored interval \( 0 \leq T \).

The obtained dependence (Fig. 4) demonstrates that the identification method is applicable when interference intensity is up to 7% from the entire range of output signal that is an evidence of its high-noise immunity.

### Practical implementation.

The identification method described in this paper was applied when developing and implementing control systems for mills of IWG (МРГ) 55 \times 75 type in conditions of the Northern Mining and Processing Plant (MPP) “SevGOK” [8].

Experimental research on identification of the mills of MPT 55 \times 75 type operating at stage 2 was done in the conditions of MPP “SevGOK”. Therein, the object structure was accepted to be attributable to Fig. 5. During the experiment mean driver power \( P \) and the signal from electronic filtering device \( A_{fp} \) were fixed directly proportional to intensity of ore load variation. In accordance with the procedure described above, by controlling the feedstock the mill was fed with at the beginning and then discharged.

The processes of signal change \( P(t) \) and \( A(t) \) fixed therein are given in Figs. 6, 7. Thus, signal of mean power \( P \) was an argument for criteria \( A \).

The main tasks of identification were as follows:

1. To identify structures of a real object relevant to the model structure (Fig. 1).
2. To identify nonlinear static characteristic of the object to use it in the obtained information about its structure when organizing optimal search of the criteria maximum.
3. To evaluate the response rate of the linear part of the model.

A prior assumption was that a structure of the slow-response part of the system (Fig. 5) corresponds to the simplest transfer function: \( \hat{W}_2 = (\hat{T}_p + 1)^{-1} \). The processes \( P(t) \) and \( A_{fp}(t) \) were processed by electronic digital computer “ЭЦВМ” applying the program in accordance with the given above procedure. Fig. 6 demonstrates the results of identification of static characteristic \( A_{fp}(P) \). The best coincidence of curves \( A_1(P) \) and \( A_{fp}(P) \) has been reached through time constant of inertial part \( T = 2.38 \) min. Divergence of curves \( A_1(P) \) and \( A_{fp}(P) \) can be explained by change in coarseness of grading of the material inside the mill after embodiment of “feeding – discharge” cycle in the process of identification. The result of identification is static characteristic \( A^*_1(P) = \left[ A_1(P) + A_{fp}(P) \right]/2 \) shown by dashed line in Fig. 8. In this case, estimate \( \hat{\delta} = \int \left[ \left( \frac{A^*_1(P) - A_1(P)}{P} \right)^2 \right]^{1/2} dP = 0.03 \) that is the
The obtained dependence of the oscillation strength on mean power \( A'(P) \) can be used for computation a dependence of intensity on filling degree \( \varphi \), if in its turn, dependence \( P \) on \( \varphi \) is known. For the mill of MTP 55 × 75 type three measurements of the in-mill filling degree and correspondent to them values of mean power: 36 % = 1.700 kWt; 41.05 % = 1.836 kWt; 45.1 % = 1.890 kWt, were made. For these three measurements approximation of dependence \( P(\varphi) \) were done within the range of filling: 36–45% by polynomial of the second power, i.e. \( P = a\varphi^2 + b\varphi + c \), where \( a = -1.2884; b = 126.46; c = -1183 \). This dependence \( P(\varphi) \) is shown in Fig. 9 with the approximation assemblies. Now, using the dependences \( A'(P) \) shown in Fig. 8 and \( P(\varphi) \) shown in Fig. 8, there is no difficulty in obtaining dependence of oscillation intensity \( A' \) on filling degree \( \varphi \) by excluding parameter \( P \).

This dependence is given in Fig. 9. It has well expressed extremum – maximum. It is practically symmetric relatively an indefinite value of \( \varphi' \) and comparatively fast wanes with offsetting \( \varphi \) from point \( \varphi' \). The obtained dependence \( A'(\varphi) \) was approximated by several curves of the appropriate form: \( A_1 = a\varphi^2 + b\varphi + c \) by the second order polynomial; \( A_2 = (a\varphi^2 + b\varphi + c)^{-1} \), where \( \Delta = 4ac - b^2 > 0 \) – the function inverse to the second order polynomial; \( A_3 = a^2/(\varphi - b)^2 + a^2/c + c \), where \( a > 0 \) – witch of Agnesi; \( A_4 = c/\sqrt{2\pi\sigma} \exp\left[ -\left(\varphi - M\right)^2/2\sigma^2\right] \) by the curve of frequency function of the normal law of distribution.

The initial data were twelve points of the dependence \( A'(\varphi) \), i.e. pair \((A_1(\varphi), j) = \Gamma.12\) (Fig. 10). The approximation problem was formed as follows

\[
J = \sum_{i=1}^{12} |A_1 - f(a, b, c, \varphi)|^2 \rightarrow \min_{a,b,c},
\]

where \( f(a, b, c, \varphi) \) is a function approximating dependence \( A'(\varphi) \). For four functions listed above the minimal value of the criteria for the second order polynomial was taken \( J_1 = 431 \cdot 10^{-4} \), for the inverse function \( J_2 = 384 \cdot 10^{-4} \), \( J_3 = 311 \cdot 10^{-4} \) for the witch of Agnesi; \( J_4 = 254 \cdot 10^{-4} \) for the normal law of distribution. As \( \min(A_1, A_2, A_3, A_4) = J_4 \), and taking into consideration the positive results of experimental dependence \( A(\varphi) \) (Fig. 10) upon the criterion \( x^2 \) on correspondence to the normal law of distribution, we can assume that regularities of the formation of statistic dependence being monitored \( A(\varphi) \) have stochastic nature.

Here, attention should be drawn to the results of the research given in [9], according to which there are parametric excitation of load fluctuations when the mill drum rotating. Moreover, it is shown that the fluctuations appear in a narrow range in the mill filling with the constant amplitude. At the same time, according to the research done with the considerations on random character filling in distribution diagram formation on the basis of multifrequent model, the analogous dependence is described by Gauss curve as that observed in practice \( A(\varphi) \) (Fig. 10).

**Conclusions.** Technological processes for reducing the size of the material, such as crushing, grinding are the most resource-intensive operations of the mining industry. Therefore, the use of the most effective operational management systems for these processes is essential in the current conditions of the mining and processing enterprise. The purpose of this publication is to develop a method for identifying mathematical models of control objects as part of an adaptive control system for preparatory processes before ore dressing.

Unlike the existing methods requiring substantial computing power, the proposed technology uses immediate calculation which considerably reduces requirements to the computing.

Besides, the proposed technology ensures higher qualitative and quantitative indicators of the outcomes data processing, including:
- higher accuracy of delimitation;
- high stability of results.

The identification method presented in this paper is rather versatile. It suggests comparatively quick filtering information about an object and has good error-rate performance.

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Метод ідентифікації нелінійних динамічних об’єктів керування підготовчими процесами перед збагаченням руд

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Мета. Розробка методу ідентифікації математичних моделей об’єктів керування у складі адаптивної системи управління підготовчими процесами перед переробкою руди.

Методика. Методологічною основою дослідження є класична позиція та фундаментальні праці закордонних і вітчизняних учень, статистика, результати авторських досліджень. У дослідженні застосована теорія нечіткості множин, порівняльний аналіз, абстракції та узагальнення наукового досвіду сучасних теоретичних досліджень. У дослідженні застосовані методи теорії нечетких множеств, порівняльний аналіз, абстракції та узагальнення наукового досвіду сучасних теоретичних досліджень.

Результати. Технологічні процеси зниження грубої молоткової підготовки мінерального матеріалу, таких як дроблення, измельчення, які описують параметри лінійних частин моделі об’єкта управління, включають в сучасні умови експлуатації гірничо-обогатительного комбінату. Описаний в роботі метод ідентифікації був впроваджений при розробці та впровадженні систем управління рудно-шлаковими млинами IWG 55 × 75 в умовах Світловодській ГЗК БПП.

Наукова новизна. Вперше в дослідженні пропонується метод идентифікації нелінійних динамічних об’єктів керування підготовчими процесами перед збагаченням руд.

Приманка. Метод відрізняється високою швидкістю видалення інформації про об’єкт. Це дозволяє визначати параметри лінійних частин і структуру нелінійної частини моделі. Описаний у роботі метод ідентифікації був впроваджений при розробці та впровадженні систем управління рудно-шлаковими млинами IWG 55 × 75 в умовах Світловодській ГЗК БПП.

Ключові слова: метод ідентифікації, нелінійний і не- станціонарний об’єкт управління, адаптивні системи, гірничо-обогатительний комбінат

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