by E. S. Page

A model of the value of computer operation is proposed, and its consequences are evaluated far enough to indicate what it is necessary to believe about the benefits of routine or preventative maintenance, in order to make such maintenance valuable. Summary:

## I INTRODUCTION

and 5 ln his turn, the owner of the computer adopts the manufacturer's advice (if he does) not merely because he trusts the manufacturer implicitly, but also because he believes that it is to his advantage to do so; in other words, he orders routine maintenance because he hopes to gain a better standard of performance from his computer. It is ч "better standard of performance" are not necessarily the Whatever the criteria, it is important to instead this paper gives an attempt to provide a basis for analysing the rather vague impressions that routine maintenance is a good or a bad thing. The arguments that are presented here apply with only minor changes of even perhaps to certain organic and of automatic digital computers recommend that regular periods be set aside for engineers o perform what is called routine or preventative main-During these periods more or less extensive tests are performed, under either normal or marginal engineering work is carried out according to a general Whatever the details of the scheme its adoption is advised because the manufacturers recommending it support their belief-that it promotes a better standard same for the owner and the manufacturer-though they analyse the conditions under which routine maintenance is worthwhile. This paper is not intended to challenge the wisdom of instituting routine maintenance on computers of today where it is performed, or conversely the wisdom of dispensing with it where this course is adopted; 2 the model is proposed and explained, necessary to realize that the criteria for assessing other types believe-and indeed may have extensive evidence of performance, in some sense, from their product. conditions or both, components are changed, of many the routine maintenance Many manufacturers human situations. machine, and may well be. In Section cenance. scheme. <u>0</u>

In Section 2 the model is proposed and explained, while in the following section a few cases covered by the theory are examined. The mathematical derivations are given in the Appendix which may be omitted by readers who are interested solely in the results.

# 2 MODEL OF COMPUTER OPERATION

The principal concern of an individual user, when he comes to the computer, is that there should be a high probability that he will be able to complete his calculation without machine failure. Mayne (1959) has proposed a model of computer operation, and has shown how to compute this probability for different lengths of

a rule according to which the sampling is performed, and the batch is accepted or rejected; it is then usually possible to calculate the probability that an individual batch will be accepted given that it contains a stated If the total cost of applying such an inspection scheme **\_** the sampling application the distribution of the quality tion will be given by a specification of the pattern of In this individual probabilities but with the behaviour over the whole pattern of problems presented to the computer by all This situation has a parallel in the sampling inspection of batches of manufactured products for The inspection scheme specifies Thus the behaviour of the inspection scheme on individual batches is known. is to be calculated, it is necessary to know not only the behaviour of the scheme on individual batches, but also the pattern of the standards of the batches presented for of the batches is described by the process curve; in the model of computer operation the corresponding descriptest, and some basic costs, for example, sampling. calculation and different computer reliabilities. are concerned not with these proportion of defective items. acceptance or rejection. problems to be done. paper we its users.

puter may vary according to the person doing the assessment. More specifically, the value of the performance of a computer to its owner or user depends on the For of n hours within a period of N hours, less than n hours The value longer than n hours would attach little value to runs of a computer which failed frequently. This latter situa-tion was often experienced in the early days of computers, α function v(x) which is the average value to a particular user of an error-free run of exactly x hours, and which is zero for negative x. The function v(x) is intended to express both the pattern of the lengths of computer runs It has been mentioned that the criteria for assessing the value of a given standard of performance of a comproblems that are to be presented to the machine. of a wide range of possible users, and they therefore attempt to ensure that their computers would regularly satisfy performance standards such as: k error-free runs lost by unscheduled maintenance in N hours, less than example, a user whose problems require error-free runs just n hours; again, it would be possible for a user with a large number of short problems to obtain results from Manufacturers naturally try to consider the requirements when their reliability was much less than it is today. express these ideas mathematically we define and the relevance of such standards to users vary. machine failures in M hours, and so on. To ш

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required by the problems and the relative values of the x; for this function error-free runs have which is small for small error-free runs () = [x/l] where square brackets of." Another the runs and perhaps may include an element for One of the simplest func-This interpretation usually applicable exactly to the operation of automatic computers, since very short runs terminated It may be more appropriate to a manufacturing machine which produces output at a uniform rate and which stops at an error. For a set of jobs of length l, a step funcirritation and loss of confidence runs is v(x) =possibility great weight to and which increases linearly for long by a failure are rarely of any value. a value proportionate to their length. attaches provoked by machine failures. problems when completed. tion is useful for v(x); v(x)part which the freedom from "integral tions is v(x) =e ~ kx). function  $e^{kx}$  – denote is not onger  $(x)_{2}$ <u>x(</u>] <

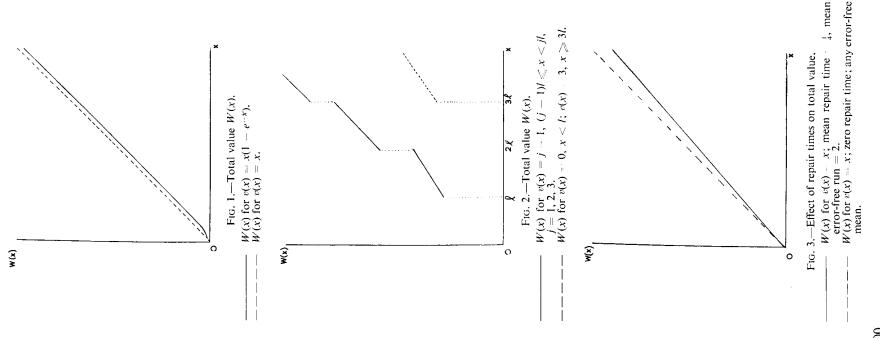
We the The model supposes that the computer is operated for a period of T hours, the first t of which are spent in of routine the computer is start of two occurrence and repair of a fault. This assumption seems reliability of the machine is not changed by the repair The characteristics of this probability distribution may depend on the time allowed for maintenance, but it is puters, which are rectified by the repair or replacement of suppose that the lengths of error-free periods are independent random variables with frequency function f(x). a reasonable one for the common types of fault in comassume that the times required to identify and repair faults are independent random variables with frequency function g(x) which standard again may depend on the routine maintenance time. is unchanged by maintenance. If further periods are performed before the T is the time between the components; the overall routine Similarly we the distribution of periods routine maintenance. maintenance are of a single fault. few assumed that switched off, consecutive ರ just of

From this model we shall calculate the total expected value to the user for periods of T hours under the different assessments of value and with distributions f(x), g(x) which are affected differently by the amount tof routine maintenance. The mathematical derivations are given in the Appendix and interpreted in the next section.

# 3 CONSEQUENCES OF THE MODEL

#### 3.1 General

total value of the computer's operation in The calculation of W(Z) from the other characteristics we have For the model described, we define a function W(Z), before the next routine maintenance period. of the model is given in the Appendix; here we consider neglected any repair time and have considered the particular case when the distribution of error-free time has The results for four of the value functions described above are shown in Figs. 1 and 2. First, particular evaluations. exponential form. the results of the expected a period



Other repair times of the orders experienced now are taken into account, the form of W(x) will still depend con-This expectation is the results in the cases the form of the value function v(x) exerts repairs, and the mean repair time is likely to be compared with the basic period over which the the smaller the probability of an error in the period considerable influence on the total value W(x). Presentday computers are not normally subject to long delays It can be expected that when Appendix. Clearly the repair times have a smaller effect confirmed by the example shown in Fig. evaluated from siderably upon the form of v(x). evaluation is considered. examples may be considered. In all small ſor

can be studied using the formulae in the Appendix. Exponential and rectangular distributions yield (A.2.7) (case k = 1) and (A.2.10) and it is seen expect that, in conditions applicable to computers, the and The effects of assuming different distributions of errorthat, even with an a priori unlikely distribution such as the rectangular, the effect of v(x) on W(x) is great and similar in substance to that for the exponential; in particular for v(x) = x, W(x) = x for all distributions when repair time is neglected. We thus have reason to model is not over-sensitive to the form of the error-free time distribution; in what follows we shall study prinshall expect the results obtained to apply qualitatively cipally an exponentially distributed error-free time for some other distributions. free time

This The appropriate value functions to be compared are step functions, the first with a single step and the second with several steps finally reaching the height of the single The total value W(x) for the shorter runs is never Particularly in the early days of computers, it was foolish to time had been avoid too much general conclusion is accepted by many programmers above, the model goes into little detail and it may be that those disagreeing with the above conclusion require An immediate consequence of the model shown by Fig. 2 is that it is more advantageous to program a long less than that for the single run. It has long been the practice of many programmers to construct long programs so that checking information is printed periodically, and so that the programs may be restarted if necessary and to them it is certainly no revelation of the model; instead its emergence from the theory will support a As it is formulated computing job so that it may be split into shorter ones. reliance on a normally high standard of reliability. after the last satisfied check in the calculation. additions and amendments to the assumptions. machine it is wise to belief in the adequacy of the model. error-free obtained; even today whatever waste step.

## 3.2 Routine Maintenance

A period will not be set aside for routine or preventative maintenance unless it is believed that some benefit is obtained by doing so; in our terms the benefit is gauged by the increase in the total value of the machine

The time devoted to routine maintenance may or may not affect the time theoretically available for computing; the engineers may start work early and complete their tests before the users There is thus usually some flexibility in the operation of the system, and this flexibility is limited by what the human beings concerned—engineers, operators, However, it is usually the situation that time spent in maintenance reduces the time for computing, and this is certainly the case during con-Accordingly, if a total time T is available and the initial period of length t is devoted to routine maintenance, we are interested in the total value in time T - t, i.e. W(T - t). tinuous twenty-four-hour operation. runs during the period considered. programmers-will accept. arrive.

Since W(Z) is a monotonic increasing function of Z it is clear that, if there is no change in the distributions than that with no maintenance, W(T). If we do routine of error-free runs and of repair time, the value when any routine maintenance is performed, W(T - t), is less maintenance, we must therefore believe that, as a consequence, the distributions of error-free run and repair time are changed, or, more drastically, that an entirely new model is necessary to describe the computer per-We shall not pursue the last alternative, and in the examples that we have worked we have only considered cases where the mean of the distributions changes but the functional form does not; the formulae quoted are, however, applicable to any form of the distributions. In computer applications the mean repair time of a fault is likely to be small whether or not routine maingeneral indication can by neglecting any change in and a tenance is performed, therefore be obtained repair time. formance.

Suppose that the effect of *t* hours of routine maintenance regularly causes a linear increase in the mean error-free run; thus for an exponential distribution  $f(x) = \lambda e^{-\lambda x}$ ,  $\lambda = (a + bt)^{-1}$ , where *a*, *b* > 0. It may be that the ultra-sceptics believe that too much maintenance causes a greater frequency of faults; if this is true the form assumed for  $\lambda$  will hold only as an approximation for the smaller values of *t*.

the For for It has been remarked that the method of assessment of the value of an error-free run affects the total value in example, if there is just one long continuous job to be tenance beforehand in order to increase as much as possible the probability that the first run would be error We have thus to compare the W(Z) given by different values of the maintenance period, t. If we just compare the two extremes in this case, no maintenance and as much maintenance as we can do and still leave general grounds that it would be advantageous to do maina period considerably, and will therefore affect decision whether or not to do routine maintenance. enough time for the problem, i.e. a period t = T - $\lambda = (a + bt)^{-1}$ performed in the given period, it seems on we have that the maintenance is worthwhile if k = 1,T-t, free. We have th (A.2.7) for Z =

$$\exp - l/(a + bt) > \{1 + (T - l)/a\} \exp - l/a. \quad (3.2.1)$$

LEAST VALUES OF h FOR ECONOMIC MAINTENANCE

q	68	86	33	21
ш	0.25	0.25	0.50	$1 \cdot 00$
а	9	×	9	8
Т	×	8	×	×

[ - ]L a Z Q

time between successive maintenance periods. mean error-free time without maintenance. mean repair time. rate of increase of error-free time with maintenance.

In this case quite a small increase in the mean error-free time can justify the period of maintenance; for example, puter with mean error-free run without maintenance of useful, v(x) = x, however large an increase in the length tenance, it is not worthwhile to do it if the repair time is negligible, but it may be if repair time is appreciable. If the probability is high that the period considered In some cases a shorter period of maintenance will be profitable. In another case where all error-free time is of a mean error-free run is obtained by routine mainis an eight-hour day and *l* a six-hour run for a comfour hours, the maintenance is worthwhile if b > 1. This inequality is certainly satisfied if b > a/(2l - c)÷

Then will be error free even when no routine maintenance is performed, it is reasonable to believe that it will not be Suppose that the repair times are approximately constant at *m* hours, and when w(x) = x, the total value W(Z) is given approximately some maintenance is worth while if dW/dt > 0 at t = 0. have the condition for economic are regularly assigned for maintenance. that the mean error-free run is a + bt, a, b > 0, t and  $\lambda = (a + bt)^{-1}$ . economic to institute maintenance. -- T -we by (A.4.4) with Z maintenance that Accordingly, t hours

#### REFERENCES

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### APPENDIX

# MATHEMATICAL DERIVATIONS

## A.1 General Solution

Under the model described, the time available for before the next routine maintenance. If the computer is error free in T - t then the value is v(T - t), and the of the second routine -t. Let W(Z) be the expected total value of the computer's operation in a period Z probability of this is  $\int_{T-t}^{T} f(x) dx$ . If an error occurs after the start 8 maintenance period is Tcomputation before

$$b > \frac{a}{T} \left[ \frac{a}{m} e^{T/a} - 1 \right]. \tag{3.2.2}$$

It must be remarked that the value function used in this example is frequently appropriate to computer operation These values show how large the gain must be from maintenance for it to be economic when the performance is good without it. when performance is high; its failings are its disregard of users' true feelings about very short error-free runs, and such runs are less frequent when reliability is good. Some values are shown in Table 1.

## 3.3 Conclusion

A model of the value of computer operation has been proposed which has as its consequences some widely held beliefs and which, in addition, sheds some light on what it is necessary to believe about the effects of routine maintenance if it is to be carried out. It appears reason-It appears reasonable in some important cases to perform maintenance immediately before a long machine run which it is necessary to complete in one piece; this merely corresponds to the prudent motorist whose usual practice is to overhaul his car before a long journey. If the performance of the computer is such that errors in the given period are infrequent, then it is probably not worth while trying to make them still less frequent. This indicates that a measure of computer efficiency that is commonly used-the ratio of error-free time to is not necessarily a useful measure of the value of the computer operation; if efficiency is near unity it may not be worth while sacrificing computer time to maintenance to make the The results indicate that it may be valuable to lengthen the period between successive spells of maintenance, and this is indeed the practice with some computers operating continuously for more than the time available for computingefficiency still nearer unity. twenty-four hours.

time x, and this error takes time y to rectify, there is still a period T - t - x - y before the next maintenance, and the expected additional value in that time is f(x)dxg(y)dy. Thus we have

$$W(T-t) = v(T-t) \int_{T-t}^{\infty} f(x) dx + \int_{0}^{\infty} f(x) dx + \int_{0}^{T-t-x} W(T-t-x-y) g(y) dy f(x) dx + \int_{0}^{T-t-x} W(T-t-x-y) g(y) dy + \int_{0}^{\infty} (A.1.1)$$

- t. Hence F ĥ Let Z

$$W(Z) = v(Z) \int_{Z}^{\infty} f(x)dx + \int_{0}^{Z} v(x)f(x)dx + \int_{0}^{Z} v(x)f(x)dx = \int_{0}^{Z} f(x)dx \int_{0}^{Z-x} W(Z-x-y)g(y)dy.$$
 (A.I.

This integral equation for W(Z) yields the function we Let an asterisk denote the Laplace Transform of a function so that require.

$$f^*(p) - \int_0^\infty e^{-px} f(x) dx.$$
 (A.1.3)

Then (A.1.2) is of the form

$$\Psi(Z) - F(Z) + \int_0^Z f(x)h(Z - x)dx.$$
 (A.1.4)

 $F(Z) = v(Z) \int_{Z}^{\infty} f(x) dx + \int_{0}^{Z} v(x) f(x) dx, \quad (A.1.5)$ where

$$h(Z) = \int_0^Z W(Z - y)g(y)dy.$$
 (A.1.6)

 $h^*(p) = W^*(p)g^*(p),$ Hence

(A.1.7)

and 
$$W^*(p) = F^*(p) + W^*(p)f^*(p)g^*(p)$$
. (A.1.8)  
Thus  $W^*(p) = F^*(p)f^*(p)f^*(p)g^*(p)$ . (A.1.0)

Thus 
$$W^*(p) = F^*(p) \{ \{1 - f^*(p)g^*(p)\}$$
 (A.1.9)

The problem of determining W(Z) is therefore reduced to the not always trivial one of inverting (A.1.9). Even if an explicit mathematical solution is difficult to obtain, a numerical one can be calculated. In the remaining sections of the Appendix special cases are evaluated: (i) repair time neglected, two functions v(x) for the same (iii) appreciable repair time, one function v(x) and one lected, one function v(x) for two distributions f(x); distribution of error-free time, f(x); (ii) repair time negdistribution f(x).

# A.2 Negligible Repair Time

If the repair time is negligible, equation (A.1.2) simplifies to

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$$W(Z) = V(Z) \int_{Z}^{Z} f(x) dx + \int_{0}^{Z} V(x) f(x) dx + \int_{0}^{Z} f(x) W(Z - x) dx, \quad (A.2.1)$$
  
so that  $W^{*}(p) = F^{*}(p) \{\{1 \dots f^{*}(p)\}, \quad (A.2.2)\}$ 

so that 
$$W^*(p) = F^*(p) |\{1 - f^*(p)\}$$
. (A.2)

ignored with the solution W(Z) = Z; this merely expresses the fact that the total error-free time in a period Z is just Z if no time is lost. More interesting The case V(x) = x degenerates if the repair time is results can be obtained for other value functions.

It is necessary to specify the form of the distribution of error-free time. One of the simplest mathematically that is likely to occur in practice is  $f(x) = \lambda e^{-\lambda x}$ , x > 0;

this distribution arises if faults occur at random at rate  $\lambda$ , so that the probability of a fault in a short interval  $\delta t$  is  $\lambda \delta t$ . We suppose that  $\lambda$  may be a function of t.

$$f^*(p) = \lambda/(\lambda - p),$$

Since

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$$W^{*}(p) = (1 \pm \lambda/p)F^{*}(p).$$
 (A.2.3)

(A.2.4)

 $W(Z) = F(Z) + \lambda \int_0^L F(x) dx.$ Hence

In particular, for 
$$v(x) = x(1 - e^{-kx})$$
, (Fig. 1)

 $k^2e^{-(\lambda+k)Z}Z/(\lambda+k)^2.$  $W(Z) = \{(k^2 + 2\lambda k)$ 

(A.2.5)

For the value function treating the situation, where k jobs each of length l need to be done, take v(x) - j - 1, — *i* jobs each of length l need to be done, take v(x) $(j-1)l \leq x < jl$  for  $j \leq k$ .

Then 
$$F(Z) = \sum_{i=1}^{i-j} e^{-i\lambda l}$$
,  $(j-1)l \leq x < jl$ , (A.2.6)

 $\sim$ 

M(Z)and

$$Z) = 0, Z < l$$
  
=  $e^{-\lambda l} \{1 + \lambda (Z - l)\}, l \leq Z < 2l$   
=  $e^{-\lambda l} \{1 + \lambda (Z - l)\} + e^{-\lambda l} \{1 + \lambda (Z - 2l)\},$   
 $2l \leq Z < 3l.$  (A.2.7)

the distribution of x is uniform in (0, d). We consider the case where d is greater than times for which the average value of operation is to be evaluated, so that there is a non-zero probability of a complete error-free period of the length we are considering. Direct solution  $< \infty$  (Fig. 2). In order to compare the effects of different distributions of error-free time, x, we take an example for which of (A.2.1) for this distribution and for value functions and so on, ending with the interval  $kl \leq Z$ such that F'(Z) exists for  $Z \leq d$ , gives

$$W'(Z) - W(Z)|d = F'(Z), \quad 0 \leq Z \leq d, \quad (A.2.8)$$

so that

$$W(Z) = e^{zld} \int_0^Z e^{-x/d} F'(x) dx, \quad 0 < Z < d, \quad (A.2.9)$$
  
e  $F'(x) = (1 - Z/d) v'(x).$ 

where

Ϊ, For the value function v(x) = 0, x < l; v(x) = 1,  $x \ge 1$ direct solution of (A.2.1) gives

$$V(Z) = 0, \quad Z < I$$
$$= \left(1 - \frac{l}{d}\right)e^{(Z - D)/d}, \quad l \leq Z \leq d. \quad (A.2.10)$$

# A.3 Exponential Repair Time

If the repair time is exponentially distributed so that  $g(x) = \mu e^{-\mu x}$ ,  $x \ge 0$ , and the error-free time has a similar distribution  $f(x) = \lambda e^{-\lambda x}$ ,  $W^*(p)$  given by (A.1.9) is easily inverted. We have

$$W^{*}(p) = \frac{(p+\lambda)(p+\mu)F^{*}(p)}{p(p+\lambda+\mu)}.$$
 (A.3.1)

x we have (Fig. 3) Ľ For v(Z)

$$W(Z) = \frac{\mu Z}{\lambda + \mu} + \frac{\lambda}{(\lambda + \mu)^2} (1 - e^{-(\lambda + \mu)Z}). \quad (A.3.2)$$

Ó, x < l; v(x) = -l,  $x \ge l$  can be obtained straightforwardly.  $e^{-kx}$ ) and for v(x)The solutions for v(x) = x(1 - x)

# A.4 Approximate Solutions

to be considered is negligible, an approximation to  $\mathcal{W}(Z)$  may be found explicitly. Since second and successive errors are to be neglected, the average value in the period is the sum of the value in the first error-free run and the value of the time to the end of the period If the probability of more than one fault in the period Hence after the repair of the first fault.

$$W(Z) \simeq v(Z) \int_{Z}^{\infty} f(x) dx + \int_{0}^{Z} v(x) f(x) dx + \int_{0}^{Z} f(x) \left\{ \int_{0}^{Z-x} v(Z-x-y) g(y) dy \right\} dx. \quad (A.4.1)$$

Thus the transform of the exact solution (A.1.9) is approximated by

$$W^*(p) \simeq F^*(p) + v^*(p)f^*(p)g^*(p).$$
 (A.4.2)

In particular, for the case v(x) = x,  $f(x) = \lambda e^{-\lambda x}$ and negligible repair time, (A.4.1) gives the exact solution W(Z) = Z. Again, for the same frequency functions but v(x) = 0, x < l; v(x) = 1, x > l, (A.4.1) gives

$$W(Z) \simeq e^{-\lambda l} + 1 - e^{-\lambda(Z-l)},$$
 (A.4.3)

If the repair time for all faults is equal to a constant m we have an approximation valid for m small compared which differs from the exact solution by  $0(\lambda^2 Z^2)$ . with Z

$$W(Z) \simeq Z - m(1 - e^{-\lambda Z}), \qquad (A.4.4)$$

directly since there is no fault in time Z with probability  $^{\lambda x}$ , and this approximation ignores the effect of the second and subsequent faults; hence time m is lost with probability  $1 - e^{-\lambda x}$ , where here we neglect the reduc-This result follows An approximation ignoring only the third and subsequent faults may be easily obtained. -- m, Z). tion in time lost when the fault occurs in (Z and  $f(x) = \lambda e^{-\lambda x}$ . × for v(x) =ð

## A.5 General

We random variables  $x_1, x_2, \ldots$  and considering problems The model of computer value that has been discussed is a stochastic process of renewal type. Instead of being given one sequence of identically distributed non-negative concerning their partial sums, we have two such sequences  $\{x\}, \{y\}$  with different distributions which represent the are interested in the random variable  $w(Z) = \sum_{i=1}^{n} w(x_i)$ , and in particular its average value W(Z), where n is the smallest integer such that  $\sum_{i=1}^{n} (x_i + y_i) > Z$ ; in the sum error-free runs and the repair times respectively.

for 
$$W(Z)$$
, the last term  $v(x_n)$  is replaced by
 $v\left\{Z - \sum_{i=1}^{n-1} (x_i + y_i)\right\}$  if  $x_n > Z - \sum_{i=1}^{n-1} (x_i - y_i)$ .

the steps are taken alternately from the distributions Alternatively we can regard the process as a random = Z, in which can be model, would deal with the case of a large number of Only the steps from the x distribution contribute to the sum w(Z). Again, the process can be regarded as arising from a counter with dead time (e.g. Smith, W. L., 1958, Section 3). Most of the previous Most of the previous is concerned with asymptotic results which, in our -and we hope that this no longer has relevance to automatic computer operation. walk, towards an absorbing barrier at xmachine faultsf(x), g(x).work

# The Mechanization of Thought Processes

The Proceedings of the Symposium on "The Mechanization of Thought Processes" held at the National Physical Laboratory on 24th–27th November 1958 have now been published. They are, as far as possible, a complete record of the Symposium, including the 32 papers in full, together with a number of appendices and a full report of the discussion. The discussion was recorded and all contributors and authors were asked to edit their contributions.

General principles-artificial intelligence, intellect, habituation, conditional probability. \_:

- Automatic programming-in Russia, America and U.K.
- Mechanical language translation. d'
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