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which for that gaging point informs him which is the erring dimension. Theoretically, at least, the capacity of the instrument is unlimited, pinions $\frac{1}{8}$ in. in length and 0.010 in. in diameter being checked as easily as large-caliber shells and large automotive parts. Nor is there any limit to the number of gaging points, for interior or exterior dimensions, that may be used at one time.

WOMEN INSPECTORS

Although women have been employed to a limited extent on peacetime production inspection, the shortage of qualified men for this work during the current national emergency has greatly stimulated the training of women inspectors. In such training courses they are given the same instruction as the men. The subjects include review of mathematics, drawing and blueprint reading, materials testing, metallography, manufacturing methods, machine-shop work, jigs, fixtures, gages and inspection methods, and actual inspection practice with the use of a wide variety of precision-measurement instruments.

The magnitude of the present war production has prompted tremendous improvements in inspection instruments and technique so that we may look forward to the ultimate resumption of peacetime activities on a far more advanced level than prior to the war, necessity being still the mother of invention and progress.

Statistical Control in Applied Science

By W. A. SHEWHART, NEW YORK, N. Y.

FOREWORD

Statistical quality control was born eighteen years ago. It was Dr. Alford, at that time editor of *Manufacturing Industries*, who two years later announced the birth, as it were, by the publication of a short article in that journal.⁸ Thereafter he watched with an active, critical interest the development of statistical-control techniques and when, in 1932, he wrote his report, "Ten Years' Progress in Management, 1923-1932," he called attention to statistical control as a tool of far-reaching significance to management. It is therefore particularly gratifying to be able to present here a brief survey of developments in statistical control that are of interest from the viewpoint of management in the hope that the comparatively rapid development of the theory and application of statistical control both here and abroad during the past ten years will bear additional testimony to Dr. Alford's ability to sense the importance of new developments in scientific method to the solution of everyday problems of management.

THIRTEEN years ago The American Society of Mechanical Engineers, in co-operation with the American Society of Testing Materials, called a round-table conference on the application of statistics in engineering and manufacturing, out of which came the organization of a committee which is now sponsored jointly by five societies.⁹ Progress in the application of statistical quality control during the past ten years is largely attributable to this co-operative attempt on the part of represen-

⁸ Bell Telephone Laboratories. Chairman of the Joint Committee for the Development of Statistical Applications in Engineering and Manufacturing.

⁹ "Finding Causes of Quality Variations," by W. A. Shewhart, *Manufacturing Industries*, vol. 11, no. 2, February, 1926, pp. 125-128.

⁹ Joint Committee for the Development of Statistical Applications in Engineering and Manufacturing sponsored by THE AMERICAN SOCIETY OF MECHANICAL ENGINEERS, the American Society for Testing Materials, The American Mathematical Society, the American Statistical Association, and the Institute of Mathematical Statistics.

tatives from several engineering and scientific organizations get people from different groups to merge their common edge of statistical techniques and to discuss their problem order to get a broader view of the usefulness of statistics. Co-operation of this character did not stop in America through the efforts of the Joint Committee and its groups, engineering societies in other countries, particularly in Great Britain, were asked to join in surveying the contributions of statistics.

INCREASE IN APPLICATIONS OF STATISTICAL CONTROL

A report of the Joint Committee describing these early activities was published in *MECHANICAL ENGINEERING* for November 1932, and should be consulted for a brief review of the early work in organizing this co-operative effort to further the application of statistics in engineering. Since then, members of the committee and its sponsor organizations have taken an active part in the development of the application of statistics. A share of the credit for progress in this direction should go to the American Society of Mechanical Engineers which, through its journal and its sectional and annual meetings, has done much to promote the work of the Joint Committee.

The few applications of statistical quality control in industry in 1932 have grown to many in 1942; too many to list here, but many are interesting, however, to review some events, both at home and abroad, which, viewed from their aftereffects, seem to have been most influential in helping to spread the knowledge and value of statistical methods.

Through the co-operation of the American Standards Association and the engineering societies represented on the committee in 1932, the British Standards Institution became interested and appointed a committee to look into the subject with the result that an excellent monograph¹⁰ by Prof. E. S. Pearson was published by them in 1935. Next in line chronologically was the awakening of the interest of the United States War Department in the value of statistical methods in the production of ordnance which finally resulted in the request of the War Department to the American Standards Association to standardize the control-chart techniques to make possible their more general use throughout the country. In accord with this request the American Standards Association has recently issued standards on this subject.¹²

At the present time, the Office of the Chief of Ordnance has undertaken a program of training conferences on the part of the quality-control technique in the various ordnance districts throughout the country. The American War Standards prepared by the American Standards Association were published by the British Standards Institution in England. Last year a joint meeting of the Institutions of Civil, Mechanical and Electrical Engineers was held in London, which, according to reports in several scientific journals,¹³ showed by the

¹⁰ "The Application of Statistical Methods to Industrial Standardization and Quality Control." In 1942, the part of this document on quality-control charts was reissued in a revised edition prepared by B. P. Dudding and W. J. Jennett, BS 600R: 1942. Prior to this the A.S.T.M. had issued an important monograph "Manual of Statistical Methods," 1932; supplement, 1935.

¹¹ See "An Engineer's Manual of Statistical Methods," by C. Simon, John Wiley and Sons, 1941, and "Quality Control in Industry," by the same author, *Electrical Engineering*, September, 1941. Z1.1, Guide for Quality Control; Z1.2, Control Chart Method of Analyzing Data; Z1.3, Control Chart Method of Controlling Production.

¹² See, for example, "The Statistical Method in Quality Control," by H. A. Review of Progress in a New Industrial Technique," by H. A. *BEAMA Journal*, May, 1942, pp. 130-133.

over 800) in attendance the interest already aroused at the same time did much to promote new applications.

CONTRIBUTIONS TO MASS PRODUCTION

Statistical control in mass production may be thought of as an attempt to maximize the advantages to be attained through interchangeability, a commonplace of production today but not revolutionary when Eli Whitney made his muskets in 1798. Four specific ways in which statistical control makes this contribution may be mentioned:

1. *Minimizes cost of inspection.* At each stage in the process attaining a state of statistical control of a production operation, the application of statistical theory makes possible the establishment of sampling plans¹⁴ that will screen at minimum cost the output of such an operation so as to meet previously specified tolerance requirements and previously specified producer and consumer risks.

2. *Minimizes number of rejections.* By helping the engineer detect the presence of assignable causes of variation so that these causes may be discovered and removed, statistical control techniques help to reduce variability of quality and hence the number of rejections.

3. *Minimizes quality assurance.* As assignable causes of variation are detected and removed, the quality of a given product provides a state of statistical control for which the assurance at the end of a piece of product will meet its tolerance requirements as a maximum. This fact is of particular importance for goods that cannot be given 100 per cent inspection because of the destructive nature of a test.

4. *Minimizes tolerance range.* The operation of statistical control provides an experimental technique for minimizing tolerance ranges. Such an operation makes possible the most efficient use of limited quantities of raw materials and provides a maximum degree of refinement attainable by any production process. Preliminary studies indicate that the operation of statistical control also provides a useful technique for eliminating assignable causes of variability in certain kinds of human effort—for example, typing and other forms of transcription. Both strategically and commercially, industrial groups and even nations often need every increment of efficiency in the use of limited quantities of raw materials and human effort that can be provided through the application of the operation of statistical control. Likewise, they often need maximum refinement in quality through elimination of assignable causes, not only in times of peace but also in time of war. As one example, the attainment of maximum homogeneity and hence minimum tolerance ranges in the properties of raw and fabricated materials may extend the potential carrying capacities of ships both in the air and on the sea.

NEED FOR AN ADEQUATE SCIENCE OF CONTROL

Out of the successful effort to apply statistical techniques in the control of quality has grown a general theory and technique of statistical control in applied science that is applicable in the whole field of the science of management defined by the Management Division of the A.S.M.E. as follows:

"Management is the art and science of preparing, organizing and directing human effort applied to control the forces and to utilize the materials of nature for the benefit of man."

Management of today is interested not only in a science of

¹⁴ For tables to assist in establishing sampling plans see "Single Sampling and Double Sampling Inspection Tables," by H. F. Dodge and H. G. Romig, *Bell System Technical Journal*, vol. 44, January, 1941, pp. 1-61.

Trans. A.S.M.E., vol. 35, 1913, p. 1272.

control helpful in "preparing, organizing, and directing human effort" to win this war but also in one helpful in utilizing to a maximum "the materials of nature for the benefit of man" when peace comes, because transition to peacetime production will present again many of the problems encountered in going from peace to war production. But that is not all. After the war, there may come proposals from many quarters, industrial, social,¹⁵ political, and the like, about the art and science of organizing and directing human effort in producing goods to satisfy in the most adequate, dependable, and economic manner the wants of all. As pointed out in a recent editorial on "Science and Politics" in one of the journals of the American Institute of Physics: "... it behooves scientists to give their serious consideration to the role of science¹⁷ in a state which is becoming increasingly centralized. . . . Important problems exist between these fields¹⁸ which can be solved to the great benefit of each if, firstly, the will to co-operate exists, secondly, the problems are fairly and properly formulated, and, thirdly, their solutions are determinedly sought under wise and resolute leadership."¹⁹

One example of a field of universal interest wherein exist many important technical problems that overlap the fields of natural and social sciences is that of price-quality control. Perhaps there are few fields where there is greater need that the problems be fairly and properly formulated. To do this, means that we must discard many popular methods of control based upon the concept of an exact or deterministic science and replace them by scientific methods that take into account, as does the theory of statistical control, the fact that the quality of goods cannot be specified with exactness and that even though they could be specified with exactness, they could not be inspected with certainty because of the inherent variability between measurements.²⁰ Then there are those many instances where the qualities cannot be measured at all without destroying that which is measured, as in the case of many quality characteristics of foods, drugs, clothes, ammunition, and so on indefinitely. Hence it is that the science of control cannot be exact but only probable. In order that we may judge wisely in these days to come, we shall likely need as never before to distinguish clearly what is, from what is not, an adequate science of control.

REQUIREMENTS OF AN ADEQUATE SCIENCE OF CONTROL

To make clear what I have in mind, let us first consider a field familiar to mechanical engineers, namely, that of mechanics. Many observed phenomena can be described satisfactorily by the laws of Newtonian mechanics. These are *deterministic* in the sense that they assume that if such and such an operation is performed, such and such measurable events will surely happen. However, some mechanical phenomena, such as those treated in statistical mechanics, cannot be explained in terms of deterministic laws; instead *statistical* laws must be introduced. Moreover, there is not *one* statistical theory of mechanics but several.

¹⁵ While writing this paragraph, an announcement of a book, "Readings in the Social Control of Industry," to be published by the Blackiston Company, Philadelphia, came to my desk. In addition to carrying fifteen signed articles, it is to give an indexed bibliography of more than 250 journal articles published mainly in the last twenty years.

¹⁶ Makes author's.

¹⁷ Science and politics.

¹⁸ "The Review of Scientific Instruments," vol. 13, August, 1941, p. 313.

¹⁹ For example, Dean-Emeritus Roscoe Pound of the Harvard Law School has discussed "The Relation of Statistical Quality Standards to Law and Legislation," in the volume, "Fluid Mechanics—Statistical Methods in Engineering," published by the University of Pennsylvania Press, 1941, page 137-146. As a background for the article he makes use of the article, "Some Aspects of Quality Control," published in *Mechanical Engineering*, December, 1939, p. 333.

The theories differ fundamentally in the physical assumptions made the basis of the assumed statistical laws. The choice between them as an interpretation of physical phenomena must be based upon their comparative abilities to fit observed facts.

The fact that observable phenomena are not explainable in terms of deterministic laws does not necessarily mean that they are explainable in terms of statistical laws. In general, as has been shown elsewhere, there are what have been called *assignable causes* that must be found and either eliminated or taken into account before valid scientific predictions can be made in terms of the tolerance limits on observable values. An adequate science of control must provide practical techniques for discovering such causes. Such a theory is provided by the theory of statistical control.

STATISTICAL CONTROL NOT MERE APPLICATION OF STATISTICS

Most of us have a certain curiosity to know something about what we are getting into before we begin to learn a new discipline. Unless we have *some* ideas about it and its relation to things otherwise familiar, we may not wish to study it at all. In the remaining paragraphs, I shall go a little way toward satisfying this curiosity, by showing how a statistical theory of control differs from simply the application of statistics to certain problems in control.

Common to any statistical theory either of mechanics or of statistical control is the use of mathematical probability or distribution theory. But the theories differ in the underlying physical postulates. In this sense, there may be more than one statistical theory of control in much the same sense that there may be, and is, more than one statistical theory of matter, and any such theory is more than classical distribution theory of mathematical statistics.

Four of the specific ways that statistical control theory in the present sense differs from classical statistics are:

1. Classical statistics start with the assumption that a statistical universe exists, whereas control theory starts with the assumption that a statistical universe does *not* exist.

Even in the statistical theory of mechanics and of radiation phenomena, it is assumed that if a deterministic theory is not adequate, then a theory based upon the assumption of the existence of laws of chance will be adequate. In the field of quality control, as already noted, it is now generally accepted, however, that measurable phenomena do not obey laws of chance until what is known as assignable causes have been discovered and taken into account.²¹

2. Statistical control theory assumes that assignable causes can be found and either eliminated or taken into account in making valid predictions.

Statistics' quality control has developed and provided a proving ground for two techniques for discovering such causes. These are: (1) the control chart technique for control of quality in production, now standardized by the American Standards Association and the British Standards Institution, and (2) the statistical run chart technique for finding assignable causes of variation in research and development.

3. Classical statistics ignores completely the ultimate goal of an applied scientist to make valid predictions in terms of tolerance limits as contrasted with the confidence limits of classical statistics.

Control engineers pointed out this fact in 1928 but it was not

until 1941 that an academic statistician took note of the prospect of making valid predictions in terms of tolerance limits.²² incidentally, knowledge of the theory of tolerance-range type prediction gives promise of contributing much to the theory of estimation and the theory of testing hypotheses of classical statistics in much the same manner that consumer and producer risks introduced into statistical quality-control theory in were the forerunner of the very important developments of J. Neyman and E. S. Pearson, in the theory of errors of the first and second kinds in modern mathematical statistics. That is, control theory has had to consider some problems not belonging in the realm of classical statistics before they recognized there.

4. Classical theory is based upon the concept of inference from a single sample from a statistical universe, the ordering within the sample being ignored, while control theory must be based upon evidence provided by a succession of samples, ordering within the sample, and other pertinent information.

Hence the three scientific steps, hypothesis, design of experiment, and test of hypothesis in approaching a state of statistical control differ from those discussed in classical statistics.²³ Moreover, the problems, before a state of statistical control has been reached, as viewed by the control statistician are essentially different. For example, at the round-table conference three years ago, statistical science was implicitly defined by the colonel, Colonel Rorty, as: (1) The assembly of broad mass data, (2) the reduction of such data graphically or mathematically to a more compact and useful form, and (3) the analysis of such data to determine useful conclusions and general laws.

But the control statistician is not concerned with assembling and reducing data in this sense until he has data worth assembling and reducing. Likewise his experience in the field of quality control has shown the uselessness of inferring "statistical laws" until the effects of assignable causes have been taken account, or, in other words, until such laws exist to be inferred. Moreover, the help of the control statistician is usually needed in designing the experiment that will give the data necessary for tracking down assignable causes; in fact his greatest contribution is most likely that of helping to design such experiments rather than in analyzing the data.

After a state of statistical control has been attained, principles of statistical inference provided by modern mathematical statistics may be taken over and applied directly for the purpose of inference in terms of confidence limits and testing statistical hypotheses. However, even under these conditions the control statistician needs to go beyond the mathematical theory discussed in texts on mathematical statistics as previously, if he is to be able to make valid predictions in terms of tolerance ranges as is desirable in applied science.

THE FUTURE PROBLEM

An adequate science of control for management should take into account the fact that measurements of phenomena in social and natural science for the most part obey neither deterministic nor statistical laws, until assignable causes of variability have been found and removed. Statistical control provides practical control-chart and run-chart techniques for discovering such causes so that they can be removed, or taken into account and it provides statistical hypotheses, experiments, and tests.

²¹ "Determination of Sample Sizes for Setting Tolerance Limits," by S. S. Wilks, "Annals of Mathematical Statistics," vol. 12, no. 1, March, 1941, pp. 91-96. This is a very important paper from the viewpoint of control.

²² For a specific illustration of how these differ, see Shewhart, *ibid.*, pp. 39 and 40.

²³ For a fuller explanation of this see Chapter 1 of "Statistical Method from the Viewpoint of Quality Control," by W. A. Shewhart, published by the Graduate School of the Department of Agriculture, 1939.

these for discovering and using statistical laws resulting when the assignable causes have been removed.

The steps involved in attaining and making the most efficient use of a given degree of control often involve the co-ordinated effort of literally thousands of employees, including physicists, chemists, engineers, sales agents, purchasing agents, lawyers, and economists. Very few of these people have ever had training in classical statistics and probability and yet many of them can be sold on the use of statistical control techniques if the control statistician is to have an opportunity of making his full contribution to management in the solution of its problems. Every situation constitutes a problem, not only for those now in the industry, but also for those responsible for training the industrial engineers of tomorrow so that they will have sufficient knowledge to themselves recognize the potential contributions of statistical control theory and technique.

In the future, the control statistician must do more than simply study, and measure the effects of, existing cause systems; he must help his colleagues devise means for modifying these systems in the best way to satisfy human wants. The control statistician must not be satisfied with simply measuring demand for goods; he must help change that demand by advertising, among other things, how to improve the quality of the goods to the consumer. He must not be content with measuring production costs; he must help decrease them.

In the future contribution of the statistical control statistician will not so much in analyzing data put to him as in helping to get the data in which assignable causes have been segregated so that analysis will lead to valid conclusions not otherwise possible. Not only may each industry expect to profit by having on its consulting staff a highly trained control statistician with a broad background of training in the physical and social sciences and with a flair for co-operation with his colleagues, but there is also a great need for creating, through college training,²⁴ a statistically minded new generation of those natural and social scientists who will have charge of preparing, organizing, and directing the effort of those who are "to control the forces and to use the materials of nature for the benefit of man."