CONTRIBUTIONS TO THE PROBLEM OF APPROXIMATION OF EQUIDISTANT DATA BY ANALYTIC FUNCTIONS*

PART A.—ON THE PROBLEM OF SMOOTHING OR GRADUATION.
A FIRST CLASS OF ANALYTIC APPROXIMATION FORMULAE

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Introduction. Let there be given a sequence of ordinates

$$\{y_n\}$$
 $(n = 0, \pm 1, \pm 2, \cdots),$

corresponding to all integral values of the variable x=n. If these ordinates are the values of a known analytic function F(x), then the problem of interpolation between these ordinates has an obvious and precise meaning: we are required to compute intermediate values F(x) to the same accuracy to which the ordinates are known. Undoubtedly, the most convenient tool for the solution of this problem is the polynomial central interpolation method. It uses the polynomial of degree k-1, interpolating k successive ordinates, as an approximation to F(x) only within a unit interval in x, centrally located with respect to its k defining ordinates. Assuming k fixed, successive approximating arcs for F(x) are thus obtained which present discontinuities on passing from one arc to the next if k is odd, or discontinuities in their first derivatives if k is even (see section 2.121). Actually these discontinuities are irrelevant in our present case of an analytic function F(x). Indeed, if the interpolated values obtained are sufficiently accurate, these discontinuities will be apparent only if we force the computation beyond the intrinsic accuracy of the y_n .

The situation is quite different if y_n are empirical data. In this case we are to determine an approximation F(x) which, for x = n, may disagree with y_n by amounts depending on the accuracy of the data, provided we thereby improve the smoothness of the resulting approximation F(x). In various applied fields such as Ballistics and Actuarial mathematics it is at times desirable to compute very smooth approximations F(x) to an accuracy surpassing by far the accuracy to which the physical or statistical function involved may be determined. This physically unjustified accuracy becomes desirable whenever the approximation F(x) enters into numerical processes of some complexity, such as the numerical solution of differential equations. Modern electronic computing machines, especially, require a good amount of forced mathematical accuracy in such auxiliary tables in order to avoid the excessive accumulation of rounding errors in the computation of the solution. These remarks justify the desirability of approximation methods to empirical data furnishing easily computed approximations F(x) which are very smooth functions of x. Approximations meeting these requirements are of two kinds: 1. Polynomial approximation, where F(x) is composed of a succession of polynomial arcs meeting with a certain number of continuous derivatives. 2. Analytic approximations, where F(x) is an analytic and regular function of x for all real values of x.

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Important work concerning polynomial approximations is to be found in the actuarial literature under the subject of osculatory interpolation. Of the extensive literature we mention especially the fundamental work of W. A. Jenkins and the valuable systematization of the subject by T. N. E. Greville. Especially important are those formulae derived by these authors which do not strictly interpolate the given ordinates, but rather combine the operation of smoothing the data and the operation of interpolation in one formula. Mr. Jenkins discusses interpolation formulae written in the convenient Everett (or Steffensen) form. Mr. Greville's starting point is his elegant expression of each polynomial arc in terms of the end point values of those derivatives which are to be continuous on passing from one arc to the next. Each of these two modes of attack has its peculiar advantages and one or the other seem indispensable for an algebraic treatment of the subject. The present writer has found the Lagrange form (explicitly in terms of the ordinates y_n) of such formulae preferable for two reasons: 1. The Lagrange form seems better adapted to computation with modern desk computing machines and undoubtedly superior for computation with punch-card machines. 2. The Lagrange form suggests a treatment of the subject by means of elementary concepts of Fourier analysis which, firstly, affords a more exhaustive treatment of the problem of polynomial approximations, secondly, shows how to extend these methods so as to furnish analytic approximations.

The explicit Lagrange form of the k-point central interpolation method, as well as of all the interpolation formulae of osculatory interpolation, is extremely simple in its formal appearance. Indeed, to every such formula corresponds an *even* function L(x), defined for all real values of x, in terms of which the corresponding formula may be written as follows

$$F(x) = \sum_{n=-\infty}^{\infty} y_n L(x-n). \tag{1}$$

The simplicity of this formula springs from the fact that it depends on the single function L(x) which describes the formula completely. Incidentally F(x) = L(x) if

$$y_0 = 1, y_n = 0 (n \neq 0).$$
 (2)

Thus every interpolation method of this kind exhibits its corresponding L(x) if we apply the method to the ordinates (2) (for an example see section 2.121).

The polynomial interpolation formulae arise from (1) if L(x) is a composite polynomial function of arcs defined by various polynomials in successive unit intervals, such that L(x) = 0 for sufficiently large values of |x| (for an important example see chapter II, formula (11)). The number of continuous derivatives of F(x) is, of course, equal to the number of continuous derivatives of L(x) for all real x.

We obtain the formally simplest interpolation formula (1) if we choose

$$L(x) = \frac{\sin \pi x}{\pi x} \tag{3}$$

¹ W. A. Jenkins, Osculatory interpolation: New derivation and formulae, Record of the American Institute of Actuaries, 15, 87 (1926).

Thomas N. E. Greville, *The general theory of osculatory interpolation*, Transactions of the Actuarial Society of America, **45**, 202–265 (1944).

W. A. Jenkins wrote four papers on this subject of which the above paper is the first. References to the other three papers are found in the excellent bibliography in Greville's paper.

in which case (1) becomes

$$F(x) = \sum_{n=-\infty}^{\infty} y_n \frac{\sin \pi(x-n)}{\pi(x-n)}.$$
 (4)

This expression which interpolates the ordinates y_n , is known to mathematicians under the name of the *cardinal series*. For this reason we wish to call the general formula (1) a formula of the *cardinal type*, referring to L(x) as the *basic function* of the formula.

The aim of the paper, of which the present Part A is the first, is twofold. Firstly, we propose to carry through to a certain stage of completion the important actuarial work concerning polynomial approximations. Incidentally, our work will answer Mr. Greville's conjecture (loc. cit. pp. 212-213) concerning the existence of an "ordinary" interpolation formula furnishing an approximation F(x) composed of polynomial arcs of degree m+2, having m continuous derivatives and such that if the data y_n are the values of a polynomial of degree m-1 then F(x) reduces identically to that polynomial. In Part B it will be shown how to obtain such formulae for every value of m. (The case of m=2 reduces to Jenkins' formula mentioned in section 2. 122.) Secondly, we shall derive formulae of the cardinal type (1) with basic functions L(x) which are analytic and regular for all real or complex values of x. The classical basic function (3) is of course analytic; however, its excessively slow rate of damping, for increasing x, makes the classical cardinal series (4) inadequate for numerical purposes. Our analytic L(x), derived in chapter IV, dampen out exponentially. In Part B we will derive similar L(x) which will dampen out even faster: like $\exp(-C^2x^2)$.

The paper is divided into five chapters. In chapter I we discuss the general problem of smoothing by means of a linear compound formula. This discussion, by no means exhaustive, is to serve as a guide to what is likely to be useful among formulae of the cardinal type (1) which smooth and interpolate at the same time. It serves to restrict somewhat the arbitrariness of the problem. The rather obvious idea of using cosine polynomials (or series) in this connection affords the possibility of a brief exposition of this subject in the more scientific manner of E. de Forest, W. F. Sheppard, E. T. Whittaker, and others, and may be followed up elsewhere.

Chapters II and III form the common foundation of both parts A and B. In chapter II we describe the interpolatory properties of the formula (1) in terms of extremely simple properties of the Fourier-transform

$$g(u) = \int_{-\infty}^{\infty} L(x) \cos ux dx \tag{5}$$

of the basic function L(x) (Theorem 4). Thus we are assured that our formula (1) will be exact for (i.e., reproduce) polynomials of degree k-1, provided g(u)-1 has a zero of order k at u=0 and g(u) has zeros of order k at all points $u=2\pi n$ $(n=\pm 1, \pm 2, \cdots)$. This elementary fact is reminiscent of N. Wiener's fundamental

² See J. M. Whittaker, Interpolatory function theory, Cambridge Tracts in Mathematics, 1935, pp. 62-64, for a discussion of the relation between the cardinal series and Stirling's interpolation series. The cardinal series was probably first investigated in an important mémoire by Ch. J. de la Vallée Poussin, Sur la convergence des formules d'interpolation entre ordonnées équidistantes, Bull. Acad. Roy. Belgique, 1908, 319-410.

description of the closure properties of the family of translation functions $\{L(x-\lambda)\}$ in terms of the zeros of g(u). Chapter III contains a somewhat general discussion of polygonal lines, the individual arcs of which are polynomials of degree k-1, joined together with k-2 continuous derivatives. A general parametric representation of such curves is obtained (Theorem 5) which greatly facilitates their use for the purpose of approximation of data. For k=4 they represent approximately the curves drawn by means of a spline and for this reason we propose to call them spline curves of order k. These polynomial spline curves are finally smoothed out, by means of one-dimensional heat flow during the time interval t, into analytic spline curves of order k. An analytic spline curve of order k is represented by a series of the cardinal type

$$F(x) = \sum_{n=-\infty}^{\infty} f_n M_k(x-n,t), \qquad (6)$$

where the basic function $M_k(x, t)$ is defined as

$$M_k(x, t) = \frac{1}{2\pi} \int_{-\infty}^{\infty} e^{-t(u/2)^2} \left(\frac{2 \sin u/2}{u}\right)^k \cos ux dx, \tag{7}$$

while the coefficients f_n may be thought of as arbitrary parameters.

The family of functions (6) forms the basis of our work. Its principal advantages for purposes of numerical approximation spring from two sources: 1) The basic function $M_k(x, t)$ dampens out like $\exp(-x^2t^{-1})$ (see III, formula (39)). As seen from our Table I, for k=4 and t=0.5, we have $M_k(x, 1/2)=0$ to something like 10 decimal places for $|x| \ge 5$. This causes the great flexibility of the graph of F(x) on varying the parameters f_n and the ease in computing F(x). 2) The family (6) contains (or represents) all polynomials of degree k-1. The simplest analytic family of this type is obtained for k=0 and t>0 when (6) becomes

$$F(x) = \sum_{n=-\infty}^{\infty} f_n \frac{1}{\sqrt{\pi t}} e^{-(x-n)^2/t}.$$
 (8)

This family obviously still enjoys the first property. However, (8) fails badly in its ability of representing even the simplest types of curves because of the low value of k=0. Indeed $F(x)\equiv 0$, for all $f_n=0$, is the only constant value (8) is capable of representing.

Chapter IV contains the chief results of the present Part A. We show how the family of curves (6) can be used to approximate given data. First we derive an analytic interpolation formula of the cardinal type (1) which leaves the given ordinates unchanged (Theorem 8). Secondly we extend the result to a family of formulae depending on a positive smoothing parameter ϵ such as to combine a certain variable amount of smoothing (depending on ϵ) with the operation of interpolation (Theorem 9).

In collaboration with Lt. J. H. Levin, the author has had the opportunity of applying on a large scale this analytic approximation method at the Ballistic Research Laboratory, Aberdeen Proving Ground, Maryland. The computations were performed on punch-card machines. The given equidistant data y_n were the values of the drag coefficient of a projectile as a function of its velocity. Since very accurately computed values of the derivatives F'(x), F''(x) of the approximation F(x) were also desired, it seems doubtful if any of the existing osculatory interpolation formulae

would have furnished satisfactory results in view of the complicated trend of the data to be approximated.

In the last chapter we discuss procedures for the accurate computation of the functions and constants tabulated at the end of the paper. The most noteworthy problem encountered in this connection is the following: Let

$$F(z) = \sum_{-\infty}^{\infty} a_n z^n \tag{9}$$

be a Laurent series which converges in a ring $\alpha < |z| < \beta$. We assume furthermore that f(z) does not vanish in this ring:

$$F(z) \neq 0, \quad (\alpha < |z| < \beta).$$
 (10)

Under these circumstances we have an expansion of the reciprocal

$$\frac{1}{F(z)} = \sum_{-\infty}^{\infty} \omega_n z^n. \tag{11}$$

If the coefficients a_n of the expansion (9) are given numerically the problem consists in finding very accurate numerical values of the ω_n . A very efficient iteration method solving this problem has been developed by H. A. Rademacher and the author. It solves the similar problem of finding the expansion of the *n*th root of f(z) and generally of any algebraic function of Laurent series. This subject will be discussed elsewhere in a joint publication with Professor Rademacher.

In a sequel to these papers we expect to discuss the fitting of curves of the form (6) to data, in the sense of least squares. This will be accomplished by constructing series of the cardinal type (1) which also enjoy the orthogonality property

$$\int_{-\infty}^{\infty} L(x)L(x-n)dx = \begin{cases} 1 & \text{if } n=0\\ 0 & \text{if } n\neq 0. \end{cases}$$

This construction reduces to the problem of computing the Laurent expansion of the square root $\sqrt{f(z)}$ of an expansion (9).

The author wishes to express his appreciation for the encouraging interest shown in his work by Dr. A. N. Lowan of the Mathematical Tables Project. He has benefited much by the helpful advice of Dr. L. S. Dederick, Major A. A. Bennett, Lt. J. H. Levin and others. Especially valuable were the author's frequent discussions with Dr. C. B. Morrey. The tables were computed by Mrs. Mildred Young. The author takes this opportunity of expressing his thanks to the officials of the Ballistic Research Laboratory for their permission to publish these tables.

The reader who is mainly interested in the numerical applications, may pass directly from this point to the Appendix, where the use of the tables is fully explained and one example is worked out.

³ It should be remarked here that also A. C. Aitken's computation in 1925 of the coefficients of E. T. Whittaker's smoothing method amounted to the expansion in a Laurent series of a certain simple rational function. See E. T. Whittaker and G. Robinson, *Calculus of observations*, London and Glasgow, 1940, pp. 308–312.

I. DEFINITIONS OF SMOOTHING AND SMOOTHING FORMULAE

1.1. A definition of smoothing formulae. Let $\{y_n\}$ $(n = \cdots -2, -1, 0, 1, 2, \cdots)$ be a given sequence or "table" which we wish to smooth. This smoothing operation is ordinarily performed by means of a formula of the following type

$$F_n = y_{n-p}L_p + \cdots + y_{n-1}L_1 + y_nL_0 + y_{n+1}L_{-1} + \cdots + y_{n+p}L_{-p}, \tag{1}$$

where the numerical coefficients L_{ν} are symmetric about the middle term L_0 , i.e., $L_{\nu}=L_{-\nu}$. The linear transformation (1) if applied to the original sequence $\{y_n\}$ will transform it into the smoothed sequence $\{F_n\}$. By extending the definition of $L_{\nu}=0$ for $|\nu|>p$ we may rewrite (1) as

$$F_n = \sum_{\nu=-\infty}^{\infty} y_{\nu} L_{n-\nu}.$$
 (2)

If $y_n = \text{const.} = c$, we also wish that $F_n = c$; therefore

$$\sum L_{\nu} = 1 \tag{3}$$

is a natural requirement.

When does the formula (1) actually smooth? As an example let p=1 and let the coefficients L_r be (-1, 3, -1). If we now apply the formula (1) to the periodic sequence

 $\{y_n\} = \{ \cdots, 0, 1, 0, 1, 0, 1, \cdots \}$

we obtain

$${F_n} = { \cdot \cdot \cdot , -2, 3, -2, 3, -2, 3, \cdot \cdot \cdot }$$

which is a good deal rougher than the original sequence. Obviously this situation deserves some clarification.

There seems no doubt that the "smoothness" of a sequence $\{y_n\}$ depends in some way on its differences of higher order, especially on the sums of their square. We also notice that the formula (2) agrees with the rule of multiplication of Fourier series. This suggests the use of such series.

Let us assume for the moment that

$$\sum_{n=-\infty}^{\infty} |y_n| < \infty. \tag{4}$$

We now define a function T(u) by

$$T(u) = \sum_{n=0}^{\infty} y_n e^{inu}$$
 (5)

and call it the *characteristic function* of our sequence $\{y_n\}$; it is a complex-valued continuous function of u of period 2π .

Now (5) implies

$$e^{-iu}T(u) = \sum y_n e^{i(n-1)u} = \sum y_{n+1}e^{inu}$$

and by subtracting (5) we get

$$(e^{-iu}-1)T(u)=\sum_{n=-\infty}^{\infty}\Delta y_n e^{inu}.$$
 (6)

This shows that we obtain the characteristic function of the sequence $\{\Delta y_n\}$ of first

differences of $\{y_n\}$ by multiplying the characteristic function T(u) of $\{y_n\}$ by the factor $e^{-iu}-1$. Generally

$$(e^{-iu}-1)^m T(u) = \sum_{n=-\infty}^{\infty} \Delta^m y_n e^{inu} \qquad (m=0, 1, 2, \cdots).$$
 (7)

Since $|e^{-iu}-1|=2 |\sin(u/2)|$, the Parseval relation furnishes the equation

$$\sum_{n=-\infty}^{\infty} (\Delta^m y_n)^2 = \frac{1}{2\pi} \int_0^{2\pi} [2 \sin (u/2)]^{2m} |T(u)|^2 du \qquad (m \ge 0).$$
 (8)

These formulae furnish an expression for the sums of the squares of the differences of any order in terms of the characteristic function T(u) of the sequence.

Let us now turn to the "smoothed" sequence $\{F_n\}$. Let

$$\phi(u) = \sum_{n=-\infty}^{\infty} L_n e^{inu} = L_0 + 2L_1 \cos u + 2L_2 \cos 2u + \cdots$$
 (9)

be the characteristic function of the sequence $\{L_n\}$. We shall also refer to $\phi(u)$ as the characteristic function of the smoothing formula (2). Notice that $\phi(u)$ is always real and even. By multiplication of the two Fourier series (5) and (9) we obtain, in view of (2),

$$T(u)\phi(u) = \sum_{n=-\infty}^{\infty} F_n e^{inu}.$$
 (10)

Hence the characteristic function of the "smoothed" sequence $\{F_n\}$ is obtained by multiplying the characteristic function T(u) of $\{y_n\}$ by the characteristic function $\phi(u)$ of the smoothing formula (2). By now applying (8) to the sequence $\{F_n\}$ we obtain

$$\sum_{n=-\infty}^{\infty} (\Delta^m F_n)^2 = \frac{1}{2\pi} \int_0^{2\pi} (2 \sin (u/2))^{2m} |T(u)|^2 (\phi(u))^2 du, \qquad (m \ge 0). \tag{11}$$

A comparison of the relations (8) and (11) will readily furnish an answer to the question: what is a smoothing formula? Indeed, we notice that the integrands in (8) and (11) differ only, for each fixed value of m, by the factor $\phi(u)^2$ in (11). This justifies the following definition.

DEFINITION 1. Let L_n be a symmetric sequence of coefficients, i.e., $L_{-n} = L_n$. The formation of the weighted means

$$F_n = \sum_{\nu=-\infty}^{\infty} y_{\nu} L_{n-\nu} \qquad (n = 0, \pm 1, \pm 2, \cdots)$$
 (12)

is said to be a smoothing formula if

$$\sum_{n} L_n = 1,\tag{13}$$

$$\sum_{n} |L_n| < \infty, \tag{14}$$

while the characteristic function

$$\phi(u) = \sum_{n=0}^{\infty} L_n e^{inu} = L_0 + 2L_1 \cos u + 2L_2 \cos 2u + \cdots$$
 (15)

satisfies the condition

$$-1 \leq \phi(u) \leq 1, \qquad (0 \leq u \leq 2\pi). \tag{16}$$

The necessity of the condition (16) is justified as follows: By a comparison of (8) and (11), in view of (16), we obtain the inequalities

$$\sum_{n=-\infty}^{\infty} (\Delta^m F_n)^2 \leq \sum_{n=-\infty}^{\infty} (\Delta^m y_n)^2, \qquad (m=0, 1, 2, \cdots).$$

Actually the equality sign in one of these relations will arise only under highly exceptional or else trivial conditions. This remark should make it clear why the smoothing quality of a formula violating (16) should be highly questionable.

So far we were concerned merely with the ability of a formula (2) to smooth the sequence. However, the discrepancies between the two sequences also deserve attention. By subtracting (10) from (5) we obtain

$$T(u)(1-\phi(u)) = \sum (y_n - F_n)e^{inu}$$

and therefore

$$\sum_{n=-\infty}^{\infty} (y_n - F_n)^2 = \frac{1}{2\pi} \int_0^{2\pi} |T(u)|^2 (1 - \phi(u))^2 du. \tag{17}$$

A comparison of the integrands of (17) and (11) reveals the obvious fact that strong smoothing may be achieved only if we allow relatively large discrepancies between F_n and y_n . Indeed, the integral of (17) will be small only if $\phi(u)$ differs but little from 1, while strong smoothing requires as small a $\phi(u)$ as possible.

- 1.11. Examples of smoothing formulae. (a) Our trivial example $L_0 = 3$, $L_1 = L_{-1} = -1$, $L_n = 0$ (n > 1) has the characteristic function $\phi(u) = 3 2 \cos u$. We find $\phi(u) \ge 1$, with $\phi(\pi) = 5$, which rules it out as a smoothing formula.
- (b) If $L_n \ge 0$ for all n, and $\sum L_r = 1$, then (12) is always a smoothing formula Indeed

$$|\phi(u)| = |\sum L_n e^{inu}| \leq \sum |L_n| = 1.$$

Thus

$$F_n = (y_{n-1} + y_n + y_{n+1})/3 (18)$$

is a smoothing formula with

$$\phi(u) = (1 + 2 \cos u)/3.$$

Let

$$\phi_1(u) = |\phi(u)| = |1 + 2 \cos u|/3 = \sum_{n=1}^{\infty} L_n^{(1)} \cos nu.$$

Since $(\phi(u))^2 = (\phi_1(u))^2$ it is clear from (11) that the formula (18) and the formula of characteristic function $\phi_1(u)$ have identical smoothing powers. However, since $0 < 1 - \phi_1(u) < 1 - \phi(u)$ for $2\pi/3 < u < 4\pi/3$, we see by (17) that the formula

$$F_n^{(1)} = \sum y_{\nu} L_{n-\nu}^{(1)}$$

will alter the sequence $\{y_n\}$ much less than (18) will.

(c) Generally, our formula (17) shows that it is desirable for an efficient smoothing formula to have its characteristic function satisfy the more restrictive condition

$$0 \le \phi(u) \le 1. \tag{19}$$

1.12. A comparison of smoothing formulae. Again our relations (11) justify the following definition.

DEFINITION 2. Let $\phi_1(u)$ and $\phi_2(u)$ be the characteristic functions of two smoothing formulae. We say that the first is stronger than the second if

$$\left| \phi_1(u) \right| \le \left| \phi_2(u) \right|. \tag{20}$$

with the inequality sign holding for some value of u.

Later in this paper we shall set up a basic sequence of smoothing formulae of progressively greater strength according to this definition. Here we remark only that two smoothing formulae cannot in general be compared on the basis of this definition. However, the following remark seems obvious. Let

$$F_n = \sum_{r} y_r L_{n-r} \tag{21}$$

be a smoothing formula of characteristic function $\phi(u)$. The iteration, or repetition, of (21) may be thought of as another smoothing formula and its characteristic function is found to be $(\phi(u))^2$. Since $|\phi(u)| \le 1$ obviously

$$(\phi(u))^2 \leq |\phi(u)|.$$

This shows that the formula (21) and the sequence of its successive iterates form a sequence of smoothing formula of progressively increasing strength.

1.13. Smoothing formulae which are exact for polynomial values of a given degree. The following definition is in common use.

DEFINITION 3. A smoothing formula (2) is said to be exact for the degree m if it reproduces exactly the values $\{y_n\}$ of a polynomial of degree not exceeding m.

If
$$F_n = \sum v_p L_{n-p} \tag{22}$$

is to be exact for the degree m, it is obviously sufficient that it be exact for the basic monomials 1, x, \cdots , x^m . Thus the exactness for the degree m is equivalent to the relations

$$n^{s} = \sum_{p=-\infty}^{\infty} \nu^{s} L_{n-p}$$
 $(s = 0, 1, \dots, m).$ (23)

Let us now assume for simplicity that the sequence of coefficients L_n tends to zero exponentially as $n \to \infty$, i.e., we assume the existence of two positive constants A and B such that

$$|L_n| \leq A e^{-B|n|}$$

for all values of n. This implies that the function

$$\phi(u) = \sum L_n e^{inu}$$

is regular in the strip

of the complex u-plane. Now

$$\phi(u) = \sum L_{r}e^{iru} = \sum L_{r-n}e^{iru} \cdot e^{-inu}$$

and

$$e^{inu}\phi(u) = \sum_{n} e^{i\nu u} L_{n-\nu}.$$

We now expand both sides in ascending powers of u and compare like coefficients. Since

$$\phi(u) = 1 + \frac{u^2}{2!} \phi'' + \frac{u^4}{4!} \phi^{(4)} + \cdots,$$

we get the identities in n

$$n^{s} - {s \choose 2} \phi'' n^{s-2} + {s \choose 4} \phi^{(4)} n^{s-4} - \cdots = \sum_{r=-\infty}^{\infty} r^{s} L_{n-r}$$
 $(s = 0, 1, 2, \cdots).$

A comparison with (23) will show that a smoothing formula is always exact for a highest degree which is always odd. It also proves the following proposition which may evidently be established under conditions less stringent than the ones we used.

THEOREM 1. A smoothing formula (22) is exact for a degree $2\nu+1$ if and only if $\phi(u)-1$ has at u=0 a zero of order $2\nu+2$, i.e.,

$$\phi''(0) = \phi^{(4)}(0) = \cdots = \phi^{(2r)}(0) = 0. \tag{24}$$

As an illustration we mention the formula

$$F_{n} = \frac{1}{32} \left(-y_{n-3} + 9y_{n-1} + 16y_{n} + 9y_{n+1} - y_{n+3} \right) = y_{n} - \frac{3}{16} \delta^{4}y_{n} - \frac{1}{32} \delta^{6}y_{n}$$
 (25)

of characteristic function

$$\phi(u) = (8 + 9 \cos u - \cos 3u)/16. \tag{26}$$

We find that $\phi''(0) = 0$, hence (25) is exact for cubics. The symmetry property $\phi(u) + \phi(\pi - u) = 1$ shows that

$$\phi(\pi) = \phi'(\pi) = \phi''(\pi) = \phi'''(\pi) = 0.$$

This results in rather strong smoothing power. The formula (25) is part of a sequence of formulae, the next one of this kind being

$$F_n = \frac{1}{512} \left(3y_{n-5} - 25y_{n-3} + 150y_{n-1} + 256y_n + 150y_{n+1} - 25y_{n+3} + 3y_{n+5} \right) \tag{27}$$

or

$$F_n = y_n + \frac{5}{32} \delta^6 y_n + \frac{15}{256} \delta^8 y_n + \frac{3}{512} \delta^{10} y_n.$$

Its characteristic function

$$\phi(u) = (128 + 150\cos u - 25\cos 3u + 3\cos 5u)/256$$

again enjoys the symmetry property $\phi(u) + \phi(\pi - u) = 1$. Also $\phi(u) - 1$ has a zero of

order 6 at u=0, hence (25) is exact for quintics, while $\phi(u)$ has a zero of order 6 at $u=\pi$ resulting in strong smoothing power.

1.2. Smoothing a finite table. In 1.1 we have discussed the smoothing of an infinite table $\{y_n\}$ which is such that the series of the absolute values of its entries converges. By (8), (11) and the inequalities (16) we have found that the sum of the squares of the differences of order m is diminished by smoothing. This is true for $m = 0, 1, 2, \cdots$. Now we shall discuss briefly the practically most important case of a given finite table

$$\{y_n\}$$
 $(n = 0, 1, \dots, N).$ (28)

To fix the ideas we assume the following simplest concrete situation: the third differences $\Delta^3 y_n$ are slowly varying and of slowly varying signs, while the $\Delta^4 y_n$ are of random signs. In this situation we naturally wish to minimize the 4th differences of the table. Now we form an average value of the $\Delta^3 y_n$ at each of the two ends of the table and we extend the column of $\Delta^3 y_n$ with the corresponding constant average value at each end. Thus the $\Delta^3 y_n$ are defined for all n having one constant value for n > N - 3 and another constant value for n < 0. Now we extend the definition of y_n for all n from the values of the third differences. Also, we compute the $\Delta^4 y_n$ for the extended infinite table. Clearly $\Delta^4 y_n = 0$ for n < -1 or n > N - 3. Let

$$T_4(u) = \sum \Delta^4 y_n e^{inu}$$

be the characteristic function of the sequence of 4th differences, the series containing really a finite sum of terms only.

Let us now apply to the extended table y_n a smoothing formula

$$F_n = \sum_{r} y_r L_{n-r} \tag{29}$$

of characteristic function $\phi(u)$, which is exact for cubics. The result is the new sequence $\{F_n\}$ $(-\infty < n < \infty)$. Evidently y_n are the values of cubics for large |n| and therefore $F_n = y_n$ for large |n|, hence also $\Delta^2 F_n = \Delta^2 y_n$ and $\Delta^4 F_n = 0$ for large |n|. Notice also that we may think of the sequence $\{\Delta^4 F_n\}$ as arising from $\{\Delta^4 y_n\}$ by the smoothing operation (29). Therefore

$$\sum_{n=-\infty}^{\infty} (\Delta^4 y_n)^2 = \frac{1}{2\pi} \int_0^{2\pi} |T_4(u)|^2 du$$

and

$$\sum_{n=-\infty}^{\infty} (\Delta^4 F_n)^2 = \frac{1}{2\pi} \int_0^{2\pi} |T_4(u)|^2 \phi(u)^2 du.$$

Generally

$$\sum_{n=-\infty}^{\infty} (\Delta^{4+m} y_n)^2 = \frac{1}{2\pi} \int_0^{2\pi} (2 \sin u/2)^{2m} |T_4(u)|^2 du, \qquad (m \ge 0)$$
 (30)

$$\sum_{n=-\infty}^{\infty} (\Delta^{4+m} F_n)^2 = \frac{1}{2\pi} \int_0^{2\pi} (2 \sin u/2)^{2m} |T_4(u)|^2 \phi(u)^2 du, \qquad (m \ge 0).$$
 (31)

⁴ Compare G. J. Lidstone, Note on the computation of terminal values in graduation by Jenkins' modified asculatory formula, Transactions of the Faculty of Actuaries (Scotland), 12, 277 (1930).

A comparison of (30) and (31) shows that the sums of the squares of the fourths and subsequent differences have been decreased by the smoothing operation. No such statement can or should be inferred concerning the finite sums of relevant differences of orders 0, 1, 2, and 3.

II. INTERPOLATION FORMULAE

2.1. Interpolation formulae of the cardinal type. Let

$$F_n = \sum_{r} y_r L_{n-r} \tag{1}$$

be a smoothing formula. If we apply it to the "elementary" table

$$y_0 = 1, y_n = 0 (n \neq 0),$$
 (2)

then $F_n = L_n$. The even sequence $\{L_n\}$ may therefore be regarded as the smoothed version by (1) of the elementary table. Now suppose that we are given not only the even sequence of ordinates L_n but an even function L(x) defined for all real x and such that $L(n) = L_n$. Then we may replace the integral variable n in (1) by the continuous variable x and we obtain the formula

$$F(x) = \sum_{\nu=-\infty}^{\infty} y_{\nu} L(x - \nu). \tag{3}$$

We call L(x) the basic function of the formula (3). The chief aim of this paper is to point out that the subject of interpolation is truly dominated by the formulae of the type (3), the kind of approximation desired depending only on the choice of the basic function L(x). The particular basic function

$$L(x) = \frac{\sin \pi x}{\pi x} \tag{4}$$

gives rise to the series

$$F(x) = \sum_{\nu=-\infty}^{\infty} y_{\nu} \frac{\sin \pi(x-\nu)}{\pi(x-\nu)}$$
 (5)

which is well known to mathematicians and referred to as the cardinal series. For this reason we wish to call (3) a series, or formula of cardinal type.

We notice here for further reference that the basic function (4) may also be written as a Fourier integral as follows.

$$\frac{\sin \pi x}{\pi x} = \frac{1}{2\pi} \int_{-\pi}^{\pi} e^{izu} du. \tag{6}$$

2.11. The two kinds of interpolation formulae, ordinary or smoothing. For integral values of x=n our formula (3) becomes

$$F(n) = \sum_{r=0}^{\infty} y_r L(n-\nu). \tag{7}$$

Equation (3) is an interpolation formula in the usual sense if $F(n) = y_n$, for all n, and this is the case if and only if L(x) satisfies the conditions

$$L(0) = 1, L(n) = 0 (n \neq 0).$$
 (8)

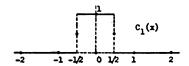
Otherwise, (7) is a smoothing formula. We shall follow the accepted actuarial practice of referring to (3) as an ordinary interpolation formula if (3) reproduces exactly the given ordinates $\{y_n\}$. Otherwise we call (3) a smoothing interpolation formula.

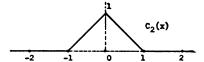
2.12. Examples of interpolation formulae of the cardinal type. Later in this paper we shall discuss various classes of such interpolation formulas all arising from a common general theory. For purposes of orientation and illustration we mention here a few concrete examples.

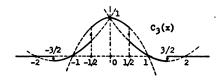
2.121. The k-point central interpolation formula. Let k be a fixed integer $(=1, 2, 3, \cdots)$. By k-point central interpolation we mean the interpolation method whereby the polynomial of degree at most k-1, defined by k consecutive ordinates y_n , is utilized within an interval of unit length centrally located with respect to the set of defining ordinates y_n . This set of k defining ordinates y_n is shifted up by one unit in the subscript for interpolation in the next unit interval. It seems obvious that this kind of interpolation is performed for any real value of x by a formula of the cardinal type

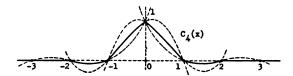
$$F(x) = \sum_{n=-\infty}^{\infty} y_n C_k(x-n)$$
 (9)

with a suitable function $C_k(x)$. To obtain this function, it is sufficient to interpolate the elementary table (2) by means of this method of k-point central interpolation. The graphs indicate the resulting $C_k(x)$ for k=1, 2, 3, and 4.5 It is found that $C_k(x)$









⁵ These graphs indicate geometrically the construction of the successive arcs of these curves. Thus $C_3(x)$ is defined in the interval 1/2 < x < 3/2 by the parabola passing through the points (0, 1), (1, 0), (2, 0). Similarly $C_4(x)$ is defined in -1 < x < 0 by the cubic which takes the values 0, 0, 1, 0 at x = -2, -1, 0, 1 respectively. We mention incidentally the following general analytic expression of the basic function $C_k(x)$ of k-point central interpolation. In terms of the "central" factorial

$$x^{[k]-1} = \begin{cases} x(x^2 - 1^2)(x^2 - 2^2) \cdots (x^2 - (\nu - 1)^2) & \text{if } k = 2\nu, \\ \left(x^2 - \frac{1}{4}\right)\left(x^2 - \frac{9}{4}\right) \cdots \left(x^2 - \frac{(2\nu - 1)^2}{4}\right) & \text{if } k = 2\nu + 1 \end{cases}$$

we define the corresponding truncated function

$$x_{+}^{[k]-1} = \begin{cases} x^{[k]-1} & \text{if } x > 0 \\ 0 & \text{if } x < 0 \end{cases} \quad (k = 1, 2, 3, \dots).$$

is a polygonal line composed of arcs of degree k-1. Also $C_k(x)$ itself is continuous with a discontinuous first derivative if k is even. For an odd k, $C_k(x)$ itself is discontinuous, the value assigned at a point of discontinuity being the arithmetic mean of the two local limits. Evidently for k=2 our formula (9) is identical with the method of linear interpolation and the graph of F(x), as given by (9), is identical with the polygonal line of vertices (n, y_n) .

For further reference we mention the following formulae which are valid for all real values of x

$$C_{1}(x) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \frac{\sin u/2}{u/2} e^{iux} du,$$

$$C_{2}(x) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \left(\frac{\sin u/2}{u/2}\right)^{2} e^{iux} du,$$

$$C_{3}(x) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \left(\frac{\sin u/2}{u/2}\right)^{3} \left(1 + \frac{1}{8} u^{2}\right) e^{iux} du,$$

$$C_{4}(x) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \left(\frac{\sin u/2}{u/2}\right)^{4} \left(1 + \frac{1}{6} u^{2}\right) e^{iux} du.$$
(10)

The k-point central interpolation method is the most important method for the interpolation and the construction of tables of analytic and regular functions. However, for the construction of tables of empirical functions, the low order of continuity of $C_k(x)$ is at times a serious limitation of this method. It seems indeed evident that the continuity properties of the linear compound

$$F(x) = \sum_{n} y_{n} L(x - n)$$

are directly dependent on the continuity properties of the basic function L(x). We turn now to an interesting example of an "osculatory" interpolation formula having a basic L(x) enjoying stronger continuity properties.

2.122. An osculatory interpolation formula of W. A. Jenkins. We define a basic function L(x) for $x \le 0$ by

$$L(x) = \begin{cases} 0 & \text{if } x \le -3 \\ -\frac{1}{12}(x+3)^3(x+2) & \text{if } -3 \le x \le -2 \\ \frac{1}{12}(x+1)(x+2)(x+3)(3x+7) & \text{if } -2 \le x \le -1 \\ \frac{1}{6}(x+1)(6-6x-9x^2-x^3) & \text{if } -1 \le x \le 0 \end{cases}$$
(11)

The definition of this function is to be completed for x=0 by continuity, if k is given, and by the arithmetic mean of the two limits, if k is odd. Then

$$C_k(x) = \frac{1}{(k-1)!} \delta^k x_+^{(k)-1} \qquad (-\infty < x < \infty),$$

where δ^k is the symbol of the kth central difference of step unity (compare Theorem 3 of section 3.11). We will return to this subject in Part B where the extremely simple law of formation of the integrals (10) will also be given.

and extend its definition by the requirement L(-x) = L(x) to all real values of x. Since the conditions (8) are visibly verified we see that

$$F(x) = \sum y_n L(x - n) \tag{11'}$$

is an ordinary interpolation formula. A closer inspection of the composite polynomial function (11) will show that L(x), L'(x), and L''(x) are all continuous for all real values of x. Using a customary mathematical terminology we may say that L(x) is of class C''. Moreover, in various ways it may be shown that the formula (11') is exact if the y_n are the ordinates of a polynomial of degree 3 or less, i.e., F(x) becomes identical with that cubic polynomial.

It is of interest to compare Jenkins' formula (11') with the 4-point central interpolation formula (9) (for k=4). Both are exact for cubics. $C_4(x)$ is of class C, while the present L(x) of class C''. This was achieved by increasing the complexity of the basic function in two ways: 1) The interval where L(x) is non-vanishing was increased from $|x| \le 2$ to $|x| \le 3$. 2) The degree of the polynomial arcs has increased from 3 to 4. Later Jenkins' formula (11') will appear as a member of a sequence of interpolation formulae of similar characteristics. Here we mention that the basic function (11) may be expressed in the form

$$L(x) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \left(\frac{\sin u/2}{u/2} \right)^4 \left(4 + \cos u - 4 \frac{\sin u}{u} \right) e^{iux} du \tag{11''}$$

for all real values of x.

2.123. A smoothing interpolation formula of W. A. Jenkins. We define a basic function L(x) by

$$L(x) = \begin{cases} 0 & \text{if } x \le -3, \\ -\frac{1}{36}(x+3)^3 & \text{if } -3 \le x \le -2, \\ \frac{1}{36}(69+117x+63x^2+11x^3) & \text{if } -2 \le x \le -1, \\ \frac{1}{18}(15-27x^2-14x^3) & \text{if } -1 \le x \le 0, \\ L(-x) = L(x). \end{cases}$$
(12)

This particular L(x), composed of cubic arcs, is of class C''. The formula 6

⁶ W. A. Jenkins writes his interpolation formula (11') in the following Everett form

$$F(n+x) = y_n \xi + \delta^2 y_n \frac{\xi(\xi^2 - 1)}{6} - \delta^4 y_n \frac{\xi^3(\xi - 1)}{12} + y_{n+1} x + \delta^2 y_{n+1} \frac{x(x^2 - 1)}{2} - \delta^4 y_{n+1} \frac{x^3(x - 1)}{12}, \quad (0 \le x \le 1, x + \xi = 1).$$

Likewise his formula (12') takes the form

$$F(n+x) = y_n \xi + \delta^2 y_n \frac{\xi(\xi^2 - 1)}{6} - \delta^4 y_n \frac{\xi^3}{36} + y_{n+1} x + \delta^2 y_{n+1} \frac{x(x^2 - 1)}{6} - \delta^4 y_{n+1} \frac{x^3}{36}.$$

$$F(x) = \sum_{x} y_{\nu} L(x - \nu) \tag{12'}$$

corresponding to (12) is exact for polynomials of degree 3 or less. However, while (11') was an ordinary interpolation formula, the formula (12') is a smoothing interpolation formula. Since

$$L(0) = 15/18$$
, $L(1) = 2/18$, $L(2) = -1/36$,

while L(n) = 0 for $n \ge 3$, we see that for x = n (12') reduces to a smoothing formula of characteristic function

$$\phi(u) = \frac{1}{18} (15 + 4 \cos u - \cos 2u).$$

We readily verify that $\phi''(0) = 0$ and $\phi(\pi) = 5/9 \le \phi(u) \le 1$. Hence (12') reduces for integral x = n to a smoothing formula, according to our Definition 1. On comparing Jenkins' two formulae (11') and (12') we notice that they are both exact for cubics, giving rise to curves of class C''. Since (12') is only a *smoothing* interpolation formula while (11') is an *ordinary* interpolation formula, it has been possible to lower the degree of L(x) from 4 to 3. We finally mention that the function (12) may be expressed as

$$L(x) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \left(\frac{\sin u/2}{u/2}\right)^4 \left(\frac{4}{3} - \frac{1}{3} \cos u\right) e^{iux} du.$$
 (12")

- 2.2. A general theory of interpolation formulae of the cardinal type. In this section we shall discuss various characteristic properties of interpolation formulae of the cardinal type in terms of the Fourier transform of the basic function L(x). This discussion will provide a sufficiently broad foundation for the subsequent development of specific formulae in the latter part of this paper.
- 2.21. Characteristic properties of interpolation formulae. Some of the following definitions have already occurred in the previous sections. For convenient reference we include them in our present enumeration of properties of an interpolation formula

$$F(x) = \sum_{\nu=-\infty}^{\infty} y_{\nu} L(x - \nu). \tag{13}$$

a. We say that (13) is an ordinary interpolation formula if F(x) interpolates exactly the given ordinates y_n , i.e., if

$$L(0) = 1, L(\nu) = 0 (\nu \neq 0). (14)$$

b. We say that (13) is a smoothing interpolation formula if for x = n (13) turns into a smoothing formula

$$F(n) = \sum_{n} y_{\nu} L(n - \nu). \tag{15}$$

The term "smoothing formula" is meant, of course, in the sense of our Definition 1, section 1.1.

c. We say that (13) is exact for the degree k-1 if the relation

$$P(x) = \sum_{n=-\infty}^{\infty} P(n)L(x-n)$$

is an identity for any polynomial P(x) of degree at most k-1. The last condition is in turn equivalent with the k identities

$$x^{\nu} = \sum_{n=-\infty}^{\infty} n^{\nu} L(x-n) \qquad (\nu = 0, 1, \dots, k-1)$$
 (16)

out of which it can always be recovered by means of suitable linear combinations.

d. We say that (13) preserves the degree k-1, if for any polynomial P(x) of degree $\nu \le k-1$ we have an identity

$$\sum_{n=-\infty}^{\infty} P(n)L(x-n) = P(x) + \text{(a polynomial of degree } < \nu\text{)}. \tag{17}$$

Notice that the leading term of P(x) is not altered by (13). Again in terms of the monomials x^{ν} we may say: (13) preserves the degree k-1 whenever the k functions

$$Q_{\nu}(x) = \sum_{n=-\infty}^{\infty} n^{\nu} L(x-n), \qquad (\nu = 0, 1, \dots, k-1),$$
 (18)

are polynomials of the form

$$Q_{\nu}(x) = x^{\nu} + a_{\nu 1}x^{\nu-1} + \cdots + a_{\nu \nu}, \qquad (\nu = 0, 1, \cdots, k-1). \tag{19}$$

- e. We say that (13) is of degree m and of class C^{μ} , if the basic function L(x) is a polygonal line of polynomial arcs of degree at most m joining in such a way as to result in a function L(x) having μ continuous derivatives. In the sequel, the junction points will always be either for integral values x=n or else for x=n+1/2. Consequently no "condensation" of discontinuities will result by the formation of the linear compound (13). Hence the interpolation curve F(x) will again be of degree m and of class C^{μ} . As examples we recall the formulae (11') and (12') of W. A. Jenkins, which are both of class C'' and of degree 4 and 3, respectively.
- f. A formula (13) whose basic function L(x) is composed of polynomial arcs will also be referred to as a polynomial interpolation formula. We shall say that it has the span s if the even function L(x) vanishes identically for x>s/2, but not for x>s' with 0 < s' < s/2. Thus the k-point central interpolation formula (9) is of span k, while both formulae (11'), (12') of Jenkins' have the span 6. For obvious practical reasons it is desirable to work with polynomial formulae having as small a span as possible.
- g. We say that (13) is an analytic interpolation formula if the basic function L(x) is analytic and regular for all real x. The original cardinal series (5) is an example of this type. Obviously no analytic formula can possibly have a finite span. The role of the span is taken over by the rate of damping of L(x) as x increases. For obvious practical reasons it is desirable to work with analytic L(x) damping out as fast as possible.
 - 2.22. The characteristic function of the basic function L(x). It was shown in chapter

⁷ This property of interpolation formulae seems to have been neglected so far. It represents an important weaker form of the condition of exactness for the degree k-1. Compare T. N. E. Greville, loc. cit. pp. 210-211, for our slight departure from the standard terminology. Jenkins speaks of a modified interpolation formula in case the formula is not ordinary. The term "modified" seems natural in view of Jenkins' construction of such formulae by modifying certain terms of Everett's formula (the author is indebted for this last remark to Mr. Chalmers L. Weaver). It seems, however, less desirable if their construction is, as here, otherwise performed.

I that various properties of a smoothing formula

$$F_n = \sum_{n} y_n L_{n-n}$$

are readily expressible in terms of its characteristic function

$$\phi(u) = \sum_{n} L_n e^{inu}.$$

Likewise, the properties of the interpolation formula

$$F(x) = \sum_{\nu} y_{\nu} L(x - \nu) \tag{20}$$

will largely depend on the behaviour of the function

$$g(u) = \int_{-\infty}^{\infty} L(x)e^{iux}dx = \int_{-\infty}^{\infty} L(x)\cos uxdx. \tag{21}$$

This even function g(u) is the Fourier transform of L(x). Following a terminology used in probability theory we shall refer to g(u) as the *characteristic function* of L(x).

Under certain general assumptions which will always be verified in our application, the relation (21) may be inverted⁸ to

$$L(x) = \frac{1}{2\pi} \int_{-\infty}^{\infty} g(u)e^{iux}du.$$
 (22)

However, it should be remarked that at times our integrals are not absolutely convergent and that they then converge only as a principal value in the sense of Cauchy: $\lim_{A\to\infty}\int_{-A}^{A}$. An example of this kind is our first formula (10)

$$C_1(x) = \frac{1}{2\pi} \int_{-x}^{\infty} \frac{\sin u/2}{u/2} e^{iux} du.$$

Changing u and x to $2\pi u$ and $x/2\pi$ respectively we see

$$C_1\left(\frac{x}{2\pi}\right) = \int_{-\infty}^{\infty} \frac{\sin \pi u}{\pi u} e^{iux} du.$$

Inverting this relation we obtain

$$\frac{\sin \pi x}{\pi x} = \frac{1}{2\pi} \int_{-\infty}^{\infty} C_1 \left(\frac{u}{2\pi}\right) e^{iux} du = \frac{1}{2\pi} \int_{-\pi}^{\pi} e^{iux} du$$
 (23)

which is identical with (6) and shows that

$$g(u) = C_1 \left(\frac{u}{2\pi}\right) = \begin{cases} 1 & \text{if } |u| < \pi \\ \frac{1}{2} & \text{if } |u| = \pi \\ 0 & \text{if } |u| > \pi \end{cases}$$

is the characteristic function of the original cardinal series (5). It is precisely the discontinuity of its characteristic function which causes the extremely slow damping of the basic function (23). (See 2.21, g.)

⁸ See e.g. S. Bochner, Vorlesungen über Fouriersche Integrale, Leipzig, 1932, Satz 11b on p. 42.

Similar reasons of slow damping will rule out the following rather obvious method of turning a given smoothing formula

$$F_n(x) = \sum_{n} y_n L_{n-n}$$

into a smoothing interpolation formula

$$F(x) = \sum_{\nu} y_{\nu} L(x - \nu).$$

From

$$\phi(u) = \sum_{n} L_n e^{inu}$$

we derive

$$L_n = \frac{1}{2\pi} \int_{-\pi}^{\pi} \phi(u) e^{inu} du.$$

Now we simply define a basic function L(x) by

$$L(x) = \frac{1}{2\pi} \int_{-\pi}^{\pi} \phi(u) e^{ixu} du.$$

The corresponding characteristic function g(u) is found to be

$$g(u) = \begin{cases} \phi(u) & \text{if } |u| < \pi \\ 0 & \text{if } |u| > \pi. \end{cases}$$

Again the discontinuities of g(u), or of one of its higher derivatives, will imply that the damping of L(x) is too slow for numerical purposes. Indeed, by partial integrations, L(x) is found to tend to zero as a certain negative power of x only, as x tends to infinity. (Concerning the order of magnitude of Fourier integrals for large values of x, see the theorem on page 11 of Bochner's book quoted in our footnote 8.)

2.23. Fundamental criteria in terms of characteristic functions. We shall now restrict ourselves to basic functions L(x) which are everywhere continuous with the exception of possible "discontinuities of the first kind" (such as were exhibited by the basic functions L(x) of section 2.121). Moreover, we shall assume that L(x) dampens out exponentially. This means that we assume the existence of two positive constants A and B such that the inequality

$$\left| L(x) \right| < Ae^{-B|x|} \tag{24}$$

holds for all real values of x. This clearly rules out the basic function (23) of the cardinal series. The assumption (24) implies that the characteristic function

$$g(u) = \int_{-\infty}^{\infty} L(x)e^{iux}dx \tag{25}$$

is analytic and regular not only on the real u-axis but also in the infinite strip

$$|Iu| < B \tag{26}$$

of the complex u-plane. It also implies that the expression

$$\lim_{p\to\infty} \sum_{n=-n}^{p} g(u+2\pi n)e^{2\pi i nx}$$
 (27)

converges uniformly in a circular neighborhood of u=0 and for every real value of x. The following theorem will demonstrate the usefulness of the characteristic function of an interpolation formula.

THEOREM 2. Let the basic function L(x) satisfy the condition (24). Let the corresponding interpolation formula be

$$F(x) = \sum_{r} y_r L(x - \nu). \tag{28}$$

For integral x = n (28) reduces to the smoothing formula

$$F(n) = \sum y_{\nu} L(n - \nu). \tag{29}$$

A. The characteristic function $\phi(u)$, of the smoothing formula (29) is given by the relation

$$\phi(u) = \sum_{\nu=-\infty}^{\infty} g(u + 2\pi\nu). \tag{30}$$

In particular (28) is an ordinary interpolation formula (see 2.21, a) if and only if

$$\sum_{\nu=-\infty}^{\infty} g(u+2\pi\nu) \equiv 1. \tag{31}$$

B. The formula (28) is exact for the degree k-1 (see 2.21, c) if the following two conditions hold simultaneously:

$$g(u) - 1 has a zero of order k at u = 0, (32)$$

g(u) has zeros of order k for all non-vanishing integral multiples of 2π ; $u = 2\pi n \ (n \neq 0)$. (33)

C. The formula (28) preserves the degree k-1 (see 2.21, d) if the condition (33) holds, together with the additional condition

$$g(0) = 1. (34)$$

Remark. For some applications it is important to notice that an ordinary interpolation formula which preserves the degree k-1 is automatically exact for the degree k-1. This seems evident a priori. It is also evident in terms of our criteria, for (31) implies

$$g(u) - 1 = -\sum_{\nu \neq 0} g(u + 2\pi\nu)$$

and the right-hand side has a zero of order k at u=0 by (33).

Proof of A. Our formula (25) implies

$$L(x) = \frac{1}{2\pi} \int_{-\infty}^{\infty} g(u)e^{ixu}du = \lim_{p \to \infty} \frac{1}{2\pi} \int_{-(2p+1)\pi}^{(2p+1)\pi} g(u)e^{ixu}du$$
$$= \lim_{p \to \infty} \frac{1}{2\pi} \sum_{n=-n}^{p} \int_{-\pi}^{\pi} g(u+2\pi\nu)e^{iux}e^{2\pi iux}du$$

$$= \lim_{p \to \infty} \frac{1}{2\pi} \int_{-\pi}^{\pi} \left\{ \sum_{\nu=-p}^{p} g(u + 2\pi\nu) e^{2\pi i x \nu} \right\} e^{iux} du,$$

$$= \frac{1}{2\pi} \int_{-\pi}^{\pi} \left\{ \sum_{\nu=-\infty}^{\infty} g(u + 2\pi\nu) e^{2\pi i x \nu} \right\} e^{iux} du.$$

In particular, if x = n is an integer, we find

$$L(n) = \frac{1}{2\pi} \int_{-\pi}^{\pi} \left\{ \sum_{-\infty}^{\infty} g(u + 2\pi\nu) \right\} e^{inu} du.$$
 (35)

Since the characteristic function $\phi(u)$ of (29) is by definition the function of Fourier coefficients L(n) (see 1.1, (9)), the relation (30) is established.

Proof of B. We wish to apply Poisson's summation formula9

$$\sum_{n=-\infty}^{\infty} f(x-n) = \sum_{n=-\infty}^{\infty} e^{2\pi i n x} \int_{-\infty}^{\infty} f(v) e^{-2\pi i v n} dv$$
 (36)

to the function

$$f(x) = e^{-ixu}L(x). (37)$$

By (37) and (25) we find

$$\int_{-\infty}^{\infty} f(v)e^{-2\pi ivn}dv = \int_{-\infty}^{\infty} L(v)e^{-i(u+2\pi n)v}dv = g(u+2\pi n)$$

hence by (36)

$$e^{-ixu}\sum_{n=-\infty}^{\infty}e^{iun}L(x-n)=\sum_{n=-\infty}^{\infty}g(u+2\pi n)e^{2\pi inx}$$

and finally

$$\sum_{n=-\infty}^{\infty} e^{iun} L(x-n) = e^{iux} \sum_{n=-\infty}^{\infty} g(u+2\pi n) e^{2\pi i nx}.$$
 (38)

This identity actually holds for all real x and all real or complex values of u within the strip (26). It contains implicitly all the statements of Theorem 1. Thus for x=0 it reduces to (30). To prove our statement B we assume x fixed and regard both members of (38) as functions of u, which we expand in series of powers of u, then equating the respective coefficients on both sides. On the left-hand side we have the expansion

$$\sum_{\nu=0}^{\infty} \frac{i^{\nu} u^{\nu}}{\nu!} \sum_{n=-\infty}^{\infty} n^{\nu} L(x-n).$$

On the right-hand side, our assumption (33) implies that the terms $g(u+2\pi n)e^{2\pi inx}$ $(n \neq 0)$ do not contribute any terms in u of order less than k. Thus our identity (38) becomes

$$\sum_{r=0}^{\infty} \frac{i^r u^r}{v!} \sum_{n=-\infty}^{\infty} n^r L(x-n) = e^{ixu} g(u) + u^k \text{ (regular function of } u\text{)}. \tag{39}$$

On the other hand our assumption (32) amounts to

⁹ See S. Bochner, loc. cit., theorem 10 on page 35.

$$g(u) = 1 + u^k$$
 (regular function).

This and (39) imply

$$\sum_{r=0}^{\infty} \frac{i^r u^r}{r!} \sum_{n=-\infty}^{\infty} n^r L(x-n) = \sum_{k=0}^{\infty} \frac{i^r u^r}{r!} x^r + u^k \text{ (regular function)}.$$
 (40)

A comparison of the coefficients of the first k terms on each side of (40) furnishes the identities (16). This concludes a proof of B.

Proof of C. Since g(u) is regular at u=0, and even, it has in view of (34) an expansion of the form

$$g(u) = 1 - \frac{a_2}{2!} u^2 + \frac{a_4}{4!} u^4 - \frac{a_{\mu}}{6!} u_6 + \cdots$$

We now define a sequence of polynomials by means of the generating function

$$e^{izu}g(u) = \sum_{r=0}^{\infty} Q_r(x) \frac{(iu)^r}{r!}$$
(41)

or

$$e^{xu}g(u/i) = \sum_{r=0}^{\infty} Q_r(x) \frac{u^r}{\nu!}$$
 (42)

where

$$g(u/i) = 1 + \frac{a_2}{2!} u^2 + \frac{a_4}{4!} u^4 + \cdots$$
 (43)

A comparison of terms on both sides of (42), using (43), shows that

$$Q_{\nu}(x) = x^{\nu} + {\nu \choose 2} a_2 x^{\nu-2} + {\nu \choose 4} a_4 x^{\nu-4} + \cdots$$
 (44)

On substituting the expansion (41) into the right-hand side of (39) and by comparison of the first k terms on both sides we find that the identities (18) and (19) are established. This completes the proof of our theorem.

As a brief illustration of our criteria let us consider again Jenkins' smoothing interpolation formula (12') of 2.123. Its basic function is

$$L(x) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \left(\frac{2\sin u/2}{u}\right)^4 \left(\frac{4}{3} - \frac{1}{3}\cos u\right) e^{iux} du. \tag{45}$$

A simple method of evaluating explicitly such integrals in order to find the polynomial expressions (12) will be discussed later. An inspection of the characteristic function

$$g(u) = \left(\frac{2\sin u/2}{u}\right)^4 (4 - \cos u)/3$$

immediately reveals that our condition (33) is verified for k=4. Direct expansion shows that $g(u)=1-(7/240)u^4+\cdots$ and (32) is also verified for k=4. The interpolation formula (12') is therefore exact for cubics. Also the fact that L(x) is of class C'' is revealed by an inspection of the integral (45). Indeed we notice that g(u) vanishes for $u=\infty$ like u^{-4} . This implies that we may differentiate (45) twice under the integral sign and that the integral

$$L''(x) = \frac{1}{2\pi} \int_{-\infty}^{\infty} g(u)(iu)^2 e^{iux} du$$

is also continuous since it converges absolutely.

III. THE THEORY OF SPLINE CURVES

The previous chapter provides a formal theory of interpolation formulae in terms of a basic function L(x) which, as yet, is largely arbitrary. The present chapter will furnish the foundation for the derivation of special basic functions which are readily computed with great accuracy and lead to interpolation formulae enjoying the properties described in the previous chapter.

3.1. Polynomial spline curves of order k. A spline is a simple mechanical device for drawing smooth curves. It is a slender flexible bar made of wood or some other elastic material. The spline is place on the sheet of graph paper and held in place at various points by means of certain heavy objects (called "dogs" or "rats") such as to take the shape of the curve we wish to draw. Let us assume that the spline is so placed and supported as to take the shape of a curve which is nearly parallel to the x-axis. If we denote by y = y(x) the equation of this curve then we may neglect its small slope y', whereby its curvature becomes

$$1/R = y''/(1 + y'^2)^{3/2} \approx y''$$
.

The elementary theory of the beam will then show that the curve y=y(x) is a polygonal line composed of cubic arcs which join continuously, with a continuous first and second derivative.¹⁰ These junction points are precisely the points where the heavy supporting objects are placed.

3.11. Description of spline curves of order k. Our last remark suggests the following definition.

DEFINITION 4. A real function F(x) defined for all real x is called a spline curve of order k and denoted by $\Pi_k(x)$ if it enjoys the following properties:

- 1) It is compressed of polynomial arcs of degree at most k-1.
- 2) It is of class C^{k-2} , i.e., F(x) has k-2 continuous derivatives.
- 3) The only possible function points of the various polynomial arcs are the integer points x = n if k is even, or else the points x = n + 1/2 if k is odd.

Thus a $\Pi_1(x)$ is a step function with possible discontinuities at the points x=n+1/2. A $\Pi_2(x)$ has an ordinary polygonal graph with vertices only at the integer points x=n. A $\Pi_4(x)$ corresponds to the elementary mathematical description of an ordinary (infinite) spline with the "dogs" placed at all or only some of the points with x=n.

It should be noticed that if a $\Pi_k(x)$ is of class C^{k-1} , then $\Pi^{(k-1)}(x)$ must necessarily be constant for all x. Thus such a $\Pi_k(x)$ reduces to a polynomial of degree k-1. It is just this relaxation of the requirement of the continuity of the (k-1)-order derivative of $\Pi_k(x)$ which turns the spline curve into a flexible and versatile instrument of approximation. Likewise, only the "dogs" (or "rats") enable the ordinary spline to trace curves differing from the graph of a cubic polynomial.

The special importance of spline curves will be due to the fact that by the addi-

¹⁰ The author is indebted for this suggestion to Professor L. H. Thomas of Ohio State University.

tion of several spline curves of successive orders we may get any desired polygonal line of given degree m and class C^{μ} .

3.12. The evaluation of certain Fourier integrals. Our further work is based on the consideration of the functions

$$M_{k}(x) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \left(\frac{2 \sin u/2}{u} \right)^{k} e^{iux} du \qquad (k = 1, 2, \dots; -\infty < x < \infty).$$
 (1)

They have been evaluated explicitly for low values of k by various authors.¹¹ The following general explicit representation is essentially due to Laplace (see J. V. Uspensky, *Introduction to mathematical probability*, 1937, Example 3, pp. 277-278).

THEOREM 3. Let k be a positive integer. Define the function x_+^{k-1} by

$$x_{+}^{k-1} = \begin{cases} x^{k-1} & \text{if } x \ge 0 \\ 0 & \text{if } x < 0. \end{cases}$$
 (2)

For k=1 and x=0 this definition is modified to $0^{k-1}=1/2$.

The following identity holds for all real values of x

$$\frac{1}{2\pi} \int_{-\infty}^{\infty} \left(\frac{2 \sin u/2}{u} \right)^{k} e^{iux} du = \frac{1}{(k-1)!} \delta^{k} x_{+}^{k-1}, \tag{3}$$

where δ^{t} stands for the usual symbol of the kth order central difference of step equal to unity.

The identity (3) is correct for k=1. Indeed it is well known that

$$\frac{1}{2\pi}\int_{-\infty}^{\infty}\frac{\sin u}{u}\,du=\tfrac{1}{2}.$$

On replacing u by ux we get that

$$\frac{1}{2\pi} \int_{-\infty}^{\infty} \frac{\sin xu}{u} du = \begin{cases} \frac{1}{2} & \text{if } x > 0 \\ 0 & \text{if } x = 0 \\ -\frac{1}{2} & \text{if } x < 0, \end{cases}$$

or

$$\frac{1}{2\pi}\int_{-\infty}^{\infty}\frac{\sin xu}{u}\,du=x_{+}^{0}-\tfrac{1}{2}.$$

Therefore

$$\frac{1}{2\pi} \int_{-\infty}^{\infty} \frac{2 \sin u/2}{u} \cos u x du = \frac{1}{2\pi} \int_{-\infty}^{\infty} \frac{\sin \left(x + \frac{1}{2}\right)u}{u} du - \frac{1}{2\pi} \int_{-\infty}^{\infty} \frac{\sin \left(x - \frac{1}{2}\right)u}{u} du$$

$$= \frac{1}{2\pi} \delta \int_{-\infty}^{\infty} \frac{\sin xu}{u} du = \delta(x_{+}^{0} - \frac{1}{2}) = \delta x_{+}^{0},$$

$$M_k^*(x) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \left(\frac{2\sin u/2}{u}\right)^k \frac{\sin ux}{u} du.$$

Using Theorem 5 below, we readily obtain the identity $M_k^*(x) = -\frac{1}{2} + (1/k!) \delta^k x_{\perp}^k$.

¹¹ See S. Bochner, *Fourier analysis*, Princeton University lectures, 1936–1937, where our $M_k(x)$ are worked out for k=1, 2, 3, and where the increasing smoothness qualities of these functions are clearly noted. Bochner also considers the integrals

and (3) is established for k=1.

Let us consider for the moment the sequence of functions

$$N_k(x) = \frac{1}{(k-1)!} \delta^k x_+^{k-1}. \tag{4}$$

We have already shown that

$$\boldsymbol{M}_{k}(x) = N_{k}(x) \tag{5}$$

holds for k=1. Assume now that (5) holds. We wish to show that the similar identity for k+1, rather than k, arises from (5) by performing the operation

$$\int_{x-1/2}^{x+1/2}$$

on both sides of (5). This will be accomplished if we prove that

$$M_{k+1}(x) = \int_{x-1/2}^{x+1/2} M_k(x) dx \tag{6}$$

and

$$N_{k+1}(x) = \int_{x-1/2}^{x+1/2} N_k(x) dx.$$
 (7)

In view of

$$\int_{x-1/2}^{x+1/2} e^{iux} dx = \frac{2 \sin u/2}{u} e^{iux}$$

we obtain (6) by an integration under the integral sign as follows

$$\int_{-\pi/2}^{-x+1/2} M_k(x) dx = \frac{1}{2\pi} \int_{-\pi}^{\infty} \left(\frac{2 \sin u/2}{u} \right)^k \left(\int_{-\pi/2}^{-x+1/2} e^{iux} dx \right) du = M_{k+1}(x).$$

To prove (7) we notice that

$$\int_{x-1/2}^{x+1/2} N_k(x) dx = \delta \int_{-\infty}^{x} N_k(x) dx = \delta \int_{-\infty}^{x} \delta^k \frac{x_+^{k-1}}{(k-1)!} dx$$
$$= \delta \delta^k \int_{-\infty}^{x} \frac{x_+^{k-1}}{(k-1)!} dx = \delta^{k+1} \frac{x_+^{k}}{k!} = N_{k+1}(x).$$

This concludes the proof of Theorem 3.

3.13. Explicit polynomial expressions for $M_k(x)$. The formula

$$M_k(x) = \frac{1}{(k-1)!} \delta^k x_+^{k-1}$$
 (8)

will readily show that $y = M_k(x)$ represents a spline curve of order k. Indeed, if k is even, then

$$(x+n)_{+}^{k-1}$$

is a Π_k and therefore also their linear combination (8). If k is odd the same conclusion holds because

$$(x+n-\frac{1}{2})_{+}^{k-1}$$

is a Π_k .

It also follows from (8) that the explicit polynomial expressions for

$$(k-1)!M_k(x),$$

in successive unit intervals, are identical with the successive partial sums of the expansion

$$\delta^k x^{k-1} = \left(x + \frac{k}{2}\right)^{k-1} - {k \choose 1} \left(x + \frac{k}{2} - 1\right)^{k-1} + \cdots + (-1)^k \left(x - \frac{k}{2}\right)^{k-1},$$

an expression which incidentally vanishes identically, being the kth order difference of a polynomial of degree k-1. We thus get

$$\begin{cases} 0 & \text{if} & x \leq -\frac{k}{2} \\ \left(x + \frac{k}{2}\right)^{k-1} & \text{if} & -\frac{k}{2} \leq x \leq -\frac{k}{2} + 1 \\ \left(x + \frac{k}{2}\right)^{k-1} - {k \choose 1} \left(x + \frac{k}{2} - 1\right)^{k-1} & \text{if} & -\frac{k}{2} + 1 \leq x \leq -\frac{k}{2} + 2 \\ & \cdots & \cdots & \cdots & \cdots \\ \left(x + \frac{k}{2}\right)^{k-1} - {k \choose 1} \left(x + \frac{k}{2} - 1\right)^{k-1} + \cdots \\ & + (-1)^{k-1} {k \choose 1} \left(x - \frac{k}{2} + 1\right)^{k-1} & \text{if} & \frac{k}{2} - 1 \leq x \leq \frac{k}{2} \\ \delta^{k} x^{k-1} = 0 & \text{if} & \frac{k}{2} \leq x. \end{cases}$$

$$(9)$$

For future reference we work out explicitly the cases k = 1, 2, 3, and 4. The expansions

$$\delta x^{0} = 1 - 1$$

$$\delta^{2}x = (x+1) - 2x + (x-1)$$

$$\delta^{3}x^{2} = (x+\frac{3}{2})^{2} - 3(x+\frac{1}{2})^{2} + 3(x-\frac{1}{2})^{2} - (x-\frac{3}{2})^{2}$$

$$\delta^{4}x^{3} = (x+2)^{3} - 4(x+1)^{3} + 6x^{3} - 4(x-1)^{3} + (x-2)^{3}$$
(10)

now furnish the following expressions

$$M_{1}(x) = \begin{cases} 0 & \text{if} & x < -\frac{1}{2} \\ 1 & \text{if} & -\frac{1}{2} < x < \frac{1}{2} \\ 0 & \text{if} & \frac{1}{2} < x, \end{cases}$$
(11)

to which must be added $M_1(\pm 1/2) = 1/2$ as required by (1) for k=1.

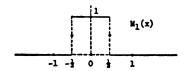
$$M_{2}(x) = \begin{cases} 0 & \text{if} & x \leq -1 \\ x+1 & \text{if} & -1 \leq x \leq 0 \\ -x+1 & \text{if} & 0 \leq x \leq 1 \\ 0 & \text{if} & 1 \leq x, \end{cases}$$
 (12)

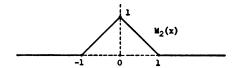
$$M_{3}(x) = \begin{cases} 0 & \text{if} & x \leq -\frac{3}{2} \\ (1/2)(x+3/2)^{2} & \text{if} & -\frac{3}{2} \leq x \leq -\frac{1}{2} \\ (1/2)(x+3/2)^{2} - (3/2)(x+1/2)^{2} & \text{if} & -\frac{1}{2} \leq x \leq \frac{1}{2} \\ (1/2)(-x+3/2)^{2} & \text{if} & \frac{1}{2} \leq x \leq \frac{3}{2} \\ 0 & \text{if} & \frac{3}{2} \leq x, \end{cases}$$

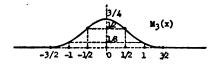
$$M_{4}(x) = \begin{cases} 0 & \text{if} & x \leq -2 \\ (1/6)(x+2)^{3} & \text{if} & -2 \leq x \leq -1 \\ (1/6)(x+2)^{3} - (4/6)(x+1)^{3} & \text{if} & -1 \leq x \leq 0 \\ (1/6)(-x+2)^{3} - (4/6)(-x+1)^{3} & \text{if} & 0 \leq x \leq 1 \\ (1/6)(-x+2)^{3} & \text{if} & 1 \leq x \leq 2 \\ 0 & \text{if} & 2 \leq x. \end{cases}$$

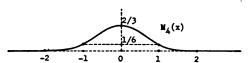
$$(14)$$

In deriving these expressions the expansions (10) were used up to the point from where the evenness of the functions $M_k(x)$ allowed us to complete their definition for all x by symmetry.









3.14. Interpolation formula with $M_k(x)$ as basic function. The interpolation formula

$$F(x) = \sum_{\nu=-\infty}^{\infty} y_{\nu} M_{k}(x - \nu)$$
 (15)

will play an important role in our subsequent work. We mention it at this place because it contributes to our investigation of k-order spline curves.

To the basic function

$$L(x) = M_k(x)$$

corresponds the characteristic function

$$g(u) = \left(\frac{2\sin u/2}{u}\right)^k,\tag{16}$$

as seen by comparing III (1) with II (22). The characteristic function of the formula (15) for integral x = n is

$$\phi_k(u) = M_k(0) + 2M_k(1) \cos u + 2M_k(2) \cos 2u + \cdots$$
 (17)

The $\{\phi_k(u)\}$ represent an interesting sequence of cosine polynomials which we will investigate more closely later in this paper. Here we mention without proof that

$$1 = \phi_1(u) = \phi_2(u) > \cdots > \phi_k(u) > \cdots > 0 \qquad (0 < u < 2\pi)$$
 (18)

while, of course, $\phi_k(0) = 1$. Hence (15) is a smoothing interpolation formula of progressively increasing strength as k increases. We assemble the various properties of (15) in the form of a theorem.

THEOREM 4.

$$F(x) = \sum_{\nu=-\infty}^{\infty} y_{\nu} M_{k}(x - \nu)$$
 (19)

is a polynomial smoothing interpolation formula of degree k-1, class C^{k-2} and span 2s=k (see sections 2.21 and 3.13). It is exact for the degree 1 and preserves the degree k-1. The smoothing power of (19) increases progressively for increasing values of k.

The exactness of (19) for the degree 1 and the preservation of the degree k-1 follow by Theorem 2 (B and C). Indeed, by (16), g(u)-1 has a double zero for u=0 while g(u) has zeros of order k for $u=2\pi n$ ($n\neq 0$). Since the preservation of the degree k-1 implies the identities II(18) and (19), the following corollary results.

COROLLARY. Any given polynomial $P_{k-1}(x)$ of degree at most k-1 may be represented in the form

$$P_{k-1}(x) = \sum_{n=-\infty}^{\infty} y_n M_k(x-n)$$
 (20)

where $\{y_n\}$ are the ordinates of some other suitably chosen polynomial of the same degree as P_{k-1} . This representation is unique.

3.15. The analytic representation of spline curves of order k. We know that if $\{y_n\}$ is an arbitrary sequence of ordinates, then our interpolation formula

$$F(x) = \sum_{n} y_n M_k(x - n) \tag{21}$$

represents a spline curve of order k. This is true because all $M_k(x-n)$ are such curves. The following question arises: Let F(x) be a given Π_k ; can we always represent it in the form (21) for an appropriate sequence $\{y_n\}$?

This question is answered affirmatively by the following theorem.

THEOREM 5. Any spline curve $\Pi_k(x)$ may be represented in one and only one way in the form

$$\Pi_k(x) = \sum_{n = -\infty}^{\infty} y_n M_k(x - n)$$
 (22)

for appropriate values of the coefficients y_n . There are no convergence difficulties since $M_k(x)$ vanishes for |x| > k/2. Thus (22) represents a Π_k for arbitrary $\{y_n\}$ and represents the most general one.

In order to prove this theorem we return to the interpolation formula (21) and differentiate it repeatedly. By (8) we have

$$M_k'(x) = \delta^k \frac{d}{dx} \frac{1}{(k-1)!} x_+^{k-1} = \delta^k \frac{1}{(k-2)!} x_+^{k-2} = \delta M_{k-1}(x)$$

and repeating we get

$$M_k^{(\nu)}(x) = \delta' M_{k-\nu}(x) \qquad (0 \le \nu \le k-1).$$
 (23)

From (21) and (23) we obtain by partial summation

$$F'(x) = \sum_{n} y_{n} \delta M_{k-1}(x-n) = \sum_{n} \delta y_{n+1/2} M_{k-1}(x-n-\frac{1}{2})$$

or

$$F'(x+\frac{1}{2}) = \sum_{n} \delta y_{n+1/2} M_{k-1}(x-n). \tag{24}$$

If k>2, this formal rule of differentiation of a spline curve may now again be applied to (24) with the result

$$F''(x+1) = \sum \delta^2 y_{n+1} M_{k-2}(x-n)$$

or

$$F''(x) = \sum \delta^2 y_n M_{k-2}(x-n).$$

Generally for $0 \le \nu \le k-1$

$$F^{(\nu)}(x) = \begin{cases} \sum_{n} \delta^{\nu} y_{n} M_{k-\nu}(x-n) & \text{if } \nu \text{ is even,} \\ \sum_{n} \delta^{\nu} y_{n+1/2} M_{k-\nu}(x-n-\frac{1}{2}) & \text{if } \nu \text{ is odd.} \end{cases}$$
 (25)

This result may be stated as follows: The vth derivative of the spline curve (21) may be obtained directly by applying the same interpolation formula (21) with $k-\nu$, rather than k, to the sequence of the vth central differences $\delta^* y$ properly centered according to the parity of ν . In particularly: $F^{(k-2)}(x)$ is obtained by interpolating linearly among the $\delta^{k-2} y$. $F^{(k-1)}(x)$ is a step function whose successive values agree with those of the corresponding $\delta^{k-1} y$.

Now let F(x) be a given Π_k . We are to show the existence of a sequence $\{y_n\}$ such that (21) holds identically. Suppose for the moment that such y_n have been found which do make (21) hold. Then by (25) for $\nu = k-1$ we have

$$F^{(k-1)}(x) = \begin{cases} \delta^{k-1} y_n & \text{for } n - \frac{1}{2} < x < n + \frac{1}{2} & \text{if } k \text{ is odd.} \\ \delta^{k-1} y_{n+1/2} & \text{for } n < x < n + 1 & \text{if } k \text{ is even.} \end{cases}$$
 (26)

In either case the successive constant values of the step function $F^{(k-1)}(x)$ determine uniquely the values of the differences of order k-1 of the sequence of the as yet unknown coefficients y_n . These differences in turn determine the coefficients y_n uniquely up to an additive sequence of vanishing differences of order k-1. Let \bar{y}_n be one sequence such that

$$\delta^{k-1} \bar{y}_{n+1/2} = F^{(k-1)} (n + \frac{1}{2})$$
 if k is even

or else

$$\delta^{k-1}\bar{y}_n = F^{(k-1)}(n) \quad \text{if} \quad k \text{ is odd.}$$

Consider the k-order spline curve

$$\overline{F}(x) = \sum_{n} \bar{y}_{n} M_{k}(x - n)$$

and let

$$R(x) = F(x) - \overline{F}(x).$$

From the way $\overline{F}(x)$ was defined it is clear that $\overline{F}^{(k-1)}(x)$ and $F^{(k-1)}(x)$ agree in their successive unit intervals of constancy. Hence R(x) is a Π_k whose various polynomial arcs are of degree k-2 or lower. Therefore R(x) is *identical* with a polynomial of degree k-2. As such it allows of a representation of the form (21) in view of our Corollary of section 3.14. Therefore also

$$F(x) = \overline{F}(x) + R(x)$$

may be represented by our formula (21).

The unicity of the representation (21) is readily established. Indeed two different such representations would imply a representation of zero

$$0 = \sum_{n} y_n M_k(x - n)$$

without all y_n vanishing. However the $\delta^{k-1}y$ all vanish, and our conclusion would contradict the uniqueness of the representation (20) of polynomials.

A simple example might illustrate our proof of Theorem 5. Let us find the representation of the spline curve of order 4

$$F(x) = \frac{1}{3!} x_+^3.$$

By (26) we have

$$\delta^{3} y_{n+1/2} = F'''(n+\frac{1}{2}) = (n+\frac{1}{2})_{+}^{0} = \begin{cases} 1 & \text{if } n \geq 0 \\ 0 & \text{if } n < 0. \end{cases}$$

A sequence having these third differences is

$$y_n = \begin{cases} 0 & \text{if } n < 0 \\ \binom{n+1}{3} = \frac{n(n^2 - 1)}{6} & \text{if } n \ge 0. \end{cases}$$

Hence

$$x_{+}^{3} = \sum_{n=0}^{\infty} n(n^{2} - 1)M_{4}(x - n), \qquad (27)$$

with the possibility still open that both member might differ by a third degree polynomial. However this possibility is excluded by the remark that both sides vanish identically for $x \le 0$. Incidentally, (27) implies

$$-(-x)_{+}^{3}=\sum_{n=-\infty}^{0}n(n^{2}-1)M_{4}(x-n)$$

and by addition and subtraction of the two relations we get the identities

$$x^3 = \sum_{n=-\infty}^{\infty} n(n^2-1)M_4(x-n), \qquad |x|^3 = \sum_{n=-\infty}^{\infty} |n(n^2-1)|M_4(x-n).$$

In later applications we shall frequently operate with polygonal lines F(x) of degree k-1 not having continuity properties as strong as a Π_k . Thus Jenkins' L(x) defined by II(11) is of degree 4 and class C''. Let F(x) be a polygonal line of degree k-1, having vertices at integral point x=n, and being for all real x a function of class C^{μ} ($-1 \le \mu \le k-2$). We certainly obtain a curve of degree k-1 and class C^{μ} by addition of spline curves.

$$F(x) = \Pi_{\mu+2} + \Pi_{\mu+3} + \cdots + \Pi_k, \qquad (28)$$

where Π_r , stands for $\Pi_r(x)$ or $\Pi_r(x+1/2)$, according to whether ν is even or odd.

THEOREM 6. Any given polygonal line F(x) of degree k-1 and class C^{μ} may be represented as a sum (28) of $k-\mu-1$ appropriate spline curves of orders $\mu+2$, $\mu+3$, \cdots , k.

This theorem is a corollary to Theorem 5. Indeed, $F^{(\mu+1)}(x)$ may have certain discontinuities. We determine a $\Pi_{\mu+2}$ having the same discontinuities in its $(\mu+1)$ st derivative. Then

$$F(x) - \Pi_{u+2}$$

is of degree k-1 and class $C^{\mu+1}$. Proceeding in this way the theorem is readily established.

Substituting for the Π , in (28) their expressions in terms of the M, we obtain an explicit (parametric) representation of such polygonal lines. Thus Jenkins' function II(11) may be represented as

$$L(x) = 4M_4(x) + \frac{1}{2}M_4(x+1) + \frac{1}{2}M_4(x-1) - 2M_5(x+\frac{1}{2}) - 2M_5(x-\frac{1}{2}).$$

At a glance we recognize a curve of degree 4, class C'', span s=6.

3.16. A summation property of spline curves. The degree of a polynomial is decreased or increased by one unit if we difference or else sum the polynomial. Not so with our spline curves Π_k . Indeed let

$$\Pi_k(x) = \sum_n y_n M_k(x - n)$$
 (29)

be a given spline curve. Then

$$\Pi_k(x+1) = \sum y_n M_k(x+1-n) = \sum y_{n+1} M_k(x-n)$$

and subtracting (29) we have

$$\Delta \Pi_{k}(x) = \Pi_{k}(x+1) - \Pi_{k}(x) = \sum \Delta y_{n} M_{k}(x-n).$$
 (30)

Hence $\Delta \Pi_k(x)$ will in general be also a Π_k . Now let the spline curve $\Pi_k^*(x)$ be given and we wish to find $\Pi_k(x)$ such that

$$\Delta\Pi_k(x) = \Pi_k^*(x). \tag{31}$$

By using Theorem 5 the solution is immediately found. Indeed let

$$\Pi_k^*(x) = \sum y_n^* M_k(x-n).$$

Now (29) will be a solution of (31) provided $\Delta y_n = y_n^*$, for all n. This relation defines the y_n up to an additive constant which appears as an arbitrary additive constant in the solution $\Pi_k(x)$. It is thus seen that the operation of differencing or summing spline curves (29) reduces to performing the same operations on the sequence of the coefficients $\{y_n\}$.

3.17. An interpretation of $M_k(x)$ in probability theory. In concluding our discussion of polynomial spline curves we mention briefly the following interpretation of $M_k(x)$. As seen from its values as given by III(11) it is clear that $M_1(x)$ may be interpreted as the probability density function of the error committed on a random real variable x, if that variable is rounded off to its nearest integral value. Now III(1) shows that the characteristic function of $M_k(x)$ is the kth power of the characteristic function of $M_1(x)$. From a known proposition in probability theory we may conclude that $M_k(x)$ is the density distribution function of the error committed on the sum

$$x_1 + x_2 + \cdots + x_k$$

of k statistically independent real random variables x_1, \dots, x_k , if each variable is replaced by its nearest integral value.

This interpretation, otherwise entirely irrelevant for our purpose, does make a few of the properties of $M_k(x)$ intuitively obvious, such as

$$M_k(x) \begin{cases} > 0 & \text{for } |x| > k/2 \\ = 0 & \text{for } |x| < k/2, \end{cases}$$
$$\int_{-\infty}^{\infty} M_k(x) dx = 1.$$

In concluding we note the identity

$$\int_{x-1/2}^{x+1/2} dx_1 \int_{x_1-1/2}^{x_1+1/2} dx_2 \cdot \cdot \cdot \int_{x_{k-1}-1/2}^{x_{k-1}+1/2} f(x_k) dx_k = \int_{-\infty}^{\infty} M_k(u-x) f(u) du.$$

3.2. Analytic spline curves of order k. The polynomial spline curves $\Pi_k(x)$ described in section 3.1 will be shown to be sufficient for the derivation of polynomial approximations to equidistant data enjoying various desirable properties. These polynomial approximations will have any a priori assigned number of continuous derivatives. However, in order to obtain analytic approximations we shall now proceed to derive from our spline curves $\Pi_k(x)$ an analoguous family of analytic functions.

To achieve this end we shall smooth out our $\Pi_k(x)$ by means of one-dimensional heat flow. Consider an infinite homogeneous bar (the x-axis) in which the temperature at the point x at the time t is denoted by F(x, t). We assume the flow of heat to be governed by the equation

$$\frac{\partial F}{\partial t} = \frac{1}{4} \frac{\partial^2 F}{\partial x^2} \,. \tag{32}$$

If F(x) = F(x, 0) is given, i.e., the temperature distribution at the time t = 0 is known,

then F(x, t) is determined by the following integral¹²

$$F(x, t) = \frac{1}{\sqrt{\pi t}} \int_{-\infty}^{\infty} e^{-(u-x)^2 t^{-1}} F(u, 0) du.$$
 (33)

This result is easy to verify: by partial differentiations we find that F(x, t) as defined by (33) indeed satisfies the differential equation (32) while familiar arguments originated by Weierstrass will show that (33) implies

$$\lim_{t\to+0}F(x,\,t)\,=\,F(x,\,0),$$

provided F(x, 0) is continuous and, e.g., bounded.

The solution of the problem of finding F(x, t), if F(x, 0) is given, is especially simple in the case when F(x, 0) is defined by a Fourier integral

$$F(x, 0) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \psi(u) e^{iux} du.$$
 (34)

Indeed, in this case we find

$$F(x, t) = \frac{1}{2\pi} \int_{-\infty}^{\infty} e^{-t(u/2)^2} \psi(u) e^{iux} du.$$
 (35)

Notice that the temperature t enters only in the additional exponential factor. This can be proved in two ways, either by substituting (34) into (33) or else by verifying directly that (35) satisfies the differential equation (32). Obviously (35) reduces to (34) for t=0, as it should.

We may (and wish to) think of F(x, t), for a fixed t > 0, as a smoothed version of F(x) = F(x; 0). In fact F(x, t) is analytic and regular for all real or complex values of x if $\psi(u)$ is, e.g., bounded.

If we now apply this heat-flow transformation to our basic k-order spline curve

$$M_k(x) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \left(\frac{2 \sin u/2}{u}\right)^k e^{iux} du \tag{36}$$

we obtain by (35) its smoothed version

$$M_k(x, t) = \frac{1}{2\pi} \int_{-\infty}^{\infty} e^{-t(u/2)^2} \left(\frac{2 \sin u/2}{u} \right)^k e^{iux} du.$$
 (37)

Obviously

$$M_k(x, 0) = M_k(x). (38)$$

¹² See H. S. Carslaw, Mathematical theory of the conduction of heat, Dover Publications, New York, 1945, Chapter III, Section 16. Certain smoothing properties of heat flow were already noticed by Ch. Sturm in 1886. See in this connection G. Pólya, Qualitatives über Wärmeausgleich, Z. angew. Math. u. Mech. 13, 125-128 (1933). It should be mentioned here that Weierstrass derived his famous approximation theorem by means of the integral (33). Finally see E. Czuber, Wahrscheinlichkeitsrechnung, vol. I, Leipzig-Berlin, 1924, pp. 417-418, for a brief sketch of a method of using (33) to derive analytic approximations to given data.

The graph of $y = M_k(x, t)$ (t > 0) is a bell-shaped curve which dampens out very fast. Later we shall learn how to compute its values very accurately. Here we mention that

$$0 < M_k(x, t) < \frac{1}{\sqrt{\pi t}} e^{-(x-k/2)^2 \cdot t^{-1}} \quad \text{if} \quad x \ge k/2. \tag{39}$$

Also, the recurrence relation III(6) generalizes so that $M_{k+1}(x, t)$ is obtained by the averaging operation

$$M_{k+1}(x, t) = \int_{x-1/2}^{x+1/2} M_k(x, t) dx.$$
 (40)

If now

$$\Pi_k(x) = \sum_{n=-\infty}^{\infty} y_n M_k(x-n)$$
 (41)

is a spline curve of order k, then its heat-flow transform is

$$\Pi_k(x, t) = \sum_{n=-\infty}^{\infty} y_n M_k(x - n, t). \tag{42}$$

The graph of this function may be called an analytic spline curve of order k. We notice that the series (42) fails to converge only if y_n increases very fast with |n|.

Summarizing we see that the curve (42) arises from the step function

$$\sum_{n} y_{n} M_{1}(x-n)$$

by k-1 successive applications of the averaging operation

$$\int_{x-1/2}^{x+1/2} () dx$$

followed by the heat-flow transformation during a time interval t. The order of application of these k operations is of course irrelevant.

The remaining parts of the paper are devoted to the problem of utilizing the two families of curves (41) and (42) for the purpose of approximating given equidistant data.

IV. A FIRST CLASS OF ANALYTIC INTERPOLATION FORMULAE

We shall now use the analytic spline curves III(42) to obtain

- 1. A smoothing interpolation formula which is exact for the degree 1 only.
- 2. An ordinary interpolation formula exact for the degree k-1.
- 3. A smoothing interpolation formula depending on a positive parameter ϵ , of strictly increasing smoothing power as ϵ increases. For $\epsilon = 0$ this formula reduces to 2, while for $\epsilon = \infty$ it is identical with 1.
- 4.1. A smoothing interpolation formula exact for the degree 1. A comparison of the formulae III(15) and III(42) immediately suggests the following analytic interpolation formula

$$F(x) = \sum_{n=-\infty}^{\infty} y_n M_k(x-n, t)$$
 (1)

where $M_k(x,t)$ is defined by III(37). For the sequel we shall use the following notation

$$\psi_k(u, t) = e^{-t(u/2)^2} \left(\frac{2 \sin u/2}{u} \right)^k, \tag{2}$$

$$\psi_k(u) = \psi_k(u, 0) = \left(\frac{2 \sin u/2}{u}\right)^k,$$
 (3)

in terms of which III(37) becomes

$$M_k(x, t) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \psi_k(u, t) e^{iux} du. \tag{4}$$

The characteristic function of the smoothing formula (1) for integral x is

$$\phi_k(u, t) = \sum_{n=-\infty}^{\infty} M_k(n, t) \cos nu.$$
 (5)

The general relation II(30) furnishes the following equivalent expression

$$\phi_k(u,t) = \sum_{\nu=-\infty}^{\infty} \psi_k(u+2\pi\nu,t). \tag{6}$$

The properties III(18) for the case t=0 generalize for t>0 as follows

$$1 > \phi_1(u, t) > \phi_2(u, t) > \cdots > \phi_k(u, t) > \cdots > 0, \qquad (0 < u < 2\pi, t > 0).$$
 (7)

Moreover, for each fixed u, $0 < u < 2\pi$, $\phi_k(u, t)$ is strictly decreasing as t increases. These last two properties we state without proving them here.

The arguments which lead to Theorem 4 now allow us to state the following theorem.

THEOREM 7. For t>0, $k=1, 2, \cdots$,

$$F(x) = \sum_{n=-\infty}^{\infty} y_n M_k(x - n, t)$$
 (8)

is an analytic smoothing interpolation formula which is exact for the degree 1 and preserves the degree k-1. The smoothing power of (8) increases whenever either k or t is increased.

4.2. An ordinary interpolation formula exact for the degree k-1. We shall now use the important property (7) to the effect that the periodic function $\phi_k(u, t)$ is positive for real u. This allows us to define the basic function

$$L_k(x,t) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \frac{\psi_k(u,t)}{\phi_k(u,t)} e^{iux} du$$
 (9)

whose characteristic function is

$$g(u) = \frac{\psi_k(u, t)}{\phi_k(u, t)}$$
 (10)

Our Theorem 2 of Chapter II will readily yield the following result.

THEOREM 8. For $t \ge 0$, $k = 1, 2, 3, \cdots$

$$F(x) = \sum_{n=-\infty}^{\infty} y_n L_k(x-n, t)$$
 (11)

is an ordinary interpolation formula which is exact for the degree k-1.

Firstly we realize by (10) and (2) that the conditions II(33), (34) of Theorem 2 are verified. Therefore (11) preserves the degree k-1. Secondly we have by (6), (10), and II(30)

$$\phi(u) = \sum_{\nu} g(u + 2\pi\nu) = \sum_{\nu} \frac{\psi_k(u + 2\pi\nu, t)}{\phi_k(u + 2\pi\nu, t)} = \frac{1}{\phi_k(u, t)} \sum_{\nu} \psi_k(u + 2\pi\nu, t) = 1.$$

Thus II(31) holds and (11) is therefore an *ordinary* interpolation formula. This concludes the proof of our theorem. Indeed, by the remark following Theorem 2 our formula (11) must also be exact for the degree k-1.

We also mention without further details the following two limiting relations

$$\lim_{t\to\infty} \frac{\psi_k(u,t)}{\phi_k(u,t)} = \lim_{k\to\infty} \frac{\psi_k(u,t)}{\phi_k(u,t)} = \begin{cases} 1 & \text{if } |u| < \pi \\ 0 & \text{if } |u| > \pi. \end{cases}$$
(12)

They show, in view of the integral representation (9), that our present basic function $L_k(x, t)$ converges towards the basic function II(6) of the original cardinal series whenever either k or else t tends to infinity.

4.3. A family of smoothing interpolation formulae depending on a smoothing parameter ϵ . In section 4.1 we have derived the smoothing interpolation formula (8) in the derivation of which no attempt was made to compromise between smoothness of results and goodness of fit. Such a compromise is afforded by the following basic function

$$L_k(x, t, \epsilon) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \frac{\epsilon + \phi_k(u, t)}{\epsilon + \phi_k(u, t)^2} \psi_k(u, t) e^{iux} du \qquad (0 \le \epsilon \le \infty)$$
 (13)

which depends also on the smoothing parameter ϵ . The corresponding interpolation formula

$$F(x) = \sum_{n=-\infty}^{\infty} y_n L_k(x - n, t, \epsilon)$$
 (14)

includes our previous formula (8) and (11) as special cases. Indeed by (13), (4) and (9) we find

$$L_k(x, t, 0) = L_k(x, t),$$
 (15)

$$L_k(x, t, \infty) = M_k(x, t). \tag{16}$$

Let us now investigate the characteristic function of the smoothing formula (14) for integral x. By (13) and II(30) this characteristic function is $(\phi_k(u, t)$ is periodic!):

$$\phi_k(u, t, \epsilon) = \frac{\epsilon + \phi_k(u, t)}{\epsilon + \phi_k(u, t)^2} \sum_{\nu} \psi_k(u + 2/\pi\nu, t).$$

This and (6) give

$$\phi_k(u, t, \epsilon) = (\epsilon \phi_k(u, t) + \phi_k(u, t)^2) / (\epsilon + \phi_k(u, t)^2). \tag{17}$$

On the other hand we have by (7) the inequalities

$$0 < \phi_k(u, t) < 1, \qquad (0 < u < 2\pi, t > 0). \tag{18}$$

Now (17), (18) imply

$$0 < \phi_k(u, t, \epsilon) < 1, \qquad (0 < u < 2\pi, t > 0, \epsilon > 0), \tag{19}$$

and therefore (14) is a smoothing interpolation formula in the sense of section 2.21 b. Moreover, we see from (17) that for fixed t and u $(0 < u < 2\pi)$ $\phi_k(u, t, \epsilon)$ decreases monotonically from

$$\phi_k(u, t, 0) = 1$$
 to $\phi_k(u, t, \infty) = \phi_k(u, t)$

as ϵ varies from $\epsilon = 0$ to $\epsilon = \infty$. Finally (14) is exact for the degree 1 and preserves the degree k-1 for the same reason as mentioned in the case of (8).

We summarize these properties in the following theorem. 13

THEOREM 9. For $t \ge 0$, $k = 1, 2, \cdots$,

$$F(x) = \sum_{n=-\infty}^{\infty} y_n L_k(x - n, t, \epsilon), \qquad (20)$$

of basic function (13), is a smoothing interpolation formula which is exact for the degree 1 and preserves the degree k-1. For $\epsilon=0$ (20) is identical with the ordinary interpolation formula (11). For increasing values of ϵ it increases in smoothing power until for $\epsilon=\infty$ (20) is identical with our smoothing formula (8).

4.31. A property of the derivatives of the approximation F(x). Let the given data $\{y_n\}$ satisfy the additional condition

$$\sum_{n=-\infty}^{\infty} |y_n| < \infty. \tag{21}$$

Assume also t>0, $\epsilon>0$. We know that the sequence $\{F(n)\}$ obtained by (20) is smoother than $\{y_n\}$ in the sense of our discussion in I Section 1.1. However, it appears

$$L(x) = \frac{1}{2\pi} \int_{-\infty}^{\infty} g(u)e^{iux}du$$

be a basic function. Let the periodic function

$$\phi(u) = \sum_{x} g(u + 2\pi\nu)$$

satisfy the inequality

$$0<\phi(u)\leq 1.$$

Then

$$L_1(x) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \frac{g(u)}{\phi(u)} e^{iux} du$$

is the basic function of an ordinary interpolation formula. Moreover

$$L_1(x, \epsilon) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \frac{\epsilon + \phi(u)}{\epsilon + \phi(u)^2} g(u) e^{iux} du$$

gives rise to a family of smoothing formulae of increasing strength, as e increases.

¹³ The method used in deriving Theorems 8 and 9 obviously generalizes as follows. Let

to be of some interest to discuss here the smoothness of the function F(x), rather than that of the sequence $\{F(n)\}$, as a function of the smoothing parameter ϵ . In this connection we prove the following

THEOREM 10. Denote by $F(x, \epsilon)$ the approximation (20) so as to indicate its dependence on ϵ . The condition (21) insures the convergence of the integrals of the squares of the derivatives

$$\int_{-\infty}^{\infty} (F^{(m)}(x, \epsilon))^2 dx, \qquad (m = 0, 1, 2, \cdots).$$
 (22)

Also each of these integrals is a monotonically decreasing function of ϵ in the range $0 < \epsilon < \infty$.

Indeed, let

$$T(u) = \sum_{n=-\infty}^{\infty} y_n e^{inu}$$
 (23)

be the characteristic function of the sequence $\{y_n\}$. For convenience we define

$$\Omega_k(u, t, \epsilon) = \frac{\epsilon + \phi_k(u, t)}{\epsilon + \phi_k(u, t)^2}.$$
 (24)

Then (13) becomes

$$L_k(x, t, \epsilon) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \Omega_k(u, t, \epsilon) \psi_k(u, t) e^{-iux} du.$$
 (25)

By substitution of (25) into (20) we obtain

$$F(x, \epsilon) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \Omega_k(u, t, \epsilon) \psi_k(u, t) T(u) e^{-iux} du.$$
 (26)

We may evidently differentiate under the integral sign obtaining

$$F^{(m)}(x, \epsilon) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \Omega_k(u, t, \epsilon) \psi_k(u, t) T(u) (-iu)^m e^{-iux} du.$$

This formula exhibits the Fourier transform of $F^{(m)}(x, \epsilon)$. We now use the analogue of the Parseval relation for Fourier integrals finally obtaining

$$\int_{-\infty}^{\infty} (F^{(m)}(x,\epsilon)^2 dx = \frac{1}{2\pi} \int_{-\infty}^{\infty} (\Omega_k(u,t,\epsilon) \psi_k(u,t))^2 \left| T(u) \right|^2 u^{2m} du. \tag{27}$$

This relation establishes our theorem. Indeed, by (24) the behaviour of the function $\Omega_k(u, t, \epsilon)$ of period of 2π , is as follows: $\Omega_k(0, t, \epsilon) = 1$, while for each fixed $u, 0 < u < 2\pi$, it decreases from

$$\Omega_k(u, t, 0) = 1/\phi_k(u, t)$$
 to $\Omega_k(u, t, \infty) = 1$,

as ϵ increases from $\epsilon = 0$ to $\epsilon = \infty$.

The discussion of I section 1.2 concerning the smoothing of a finite table also has an analogue concerning the derivatives of the approximations $F(x, \epsilon)$. We state the

result without further details. We assume the concrete situation of I section 1.2 where a finite table was extended to an infinite table by constant third differences at each end. To this extended table we apply our formula (20) with such a value of k which will insure that the formula (20) preserves cubics, i.e., $k \ge 4$. Then we can prove that the integrals (22) converge for m=4, 5, 6, \cdots and represent decreasing functions of ϵ .

4.32. Formula (20) as applied to subtabulation. Our formula (20) is excellently suited for the systematic interpolation, or subtabulation of given ordinates y_n . It is less suited for interpolation. The reason is obvious: For subtabulation to tenths we need only a table of the basic function $L_k(x, t, \epsilon)$ for the step h = 0.1 only, while interpolation would call for a much more elaborate table of this function.

The following transformation of the formula (20), in terms of the function $M_k(x, t)$, is of importance for numerical applications. First of all we expand the even periodic function (24) in a Fourier (cosine series)

$$\Omega_k(u, t, \epsilon) = \frac{\epsilon + \phi_k(u, t)}{\epsilon + \phi_k(u, t)^2} = \sum_{\nu = -\infty}^{\infty} \omega_{\nu}^{(k)}(t, \epsilon) e^{i\nu u} = \sum_{\nu = -\infty}^{\infty} \omega_{\nu}^{(k)}(t, \epsilon) \cos \nu u.$$
 (28)

Substituting this expansion into (25) we get

$$L_k(x, t, \epsilon) = \sum_{r=-\infty}^{\infty} \omega_r^{(k)}(t, \epsilon) \frac{1}{2\pi} \int_{-\infty}^{\infty} \psi_k(u, t) e^{i(r-x)u} du,$$

which in view of (4) becomes

$$L_k(x, t, \epsilon) = \sum_{r=0}^{\infty} \omega_r^{(k)}(t, \epsilon) M_k(x - \nu, t).$$
 (29)

This formula expresses the basic function $L_k(x, t, \epsilon)$ in terms of the $M_k(x)$. If we substitute this expansion into our formula (20) we obtain

$$F(x) = \sum_{n} y_n L_k(x - n, t, \epsilon) = \sum_{n} y_n \omega_{\nu}^{(k)}(t, \epsilon) M_k(x - n - \nu, t)$$

and replacing ν by $\nu - n$

$$F(x) = \sum_{n,n} y_n \omega_{\nu-n}^{(k)}(t, \epsilon) M_k(x - \nu, t).$$

A first summation by n introduces the sums

$$f_{r} = \sum_{n=0}^{\infty} y_{n} \omega_{r-n}^{(k)}(t, \epsilon)$$
 (30)

in terms of which our last expression becomes

$$F(x) = \sum_{p=-\infty}^{\infty} f_p M_k(x - \nu, t). \tag{31}$$

The pair of relations (30) and (31) is equivalent to (20) and represents its practical form. The reason for this is that the basic function $M_k(x, t)$ dampens out like

 $\exp(-x^2)$ (see III (39)) while $L_k(x, t, \epsilon)$, $\epsilon < \infty$, dampens out like $\exp(-x)$ only. We notice incidentally that (31) is identical with our formula (8), to be applied to the new computed ordinates $\{f_n\}$ given by (30).

Frequently we require also tables of the derivatives F'(x) and F''(x), of the approximation F(x). These are then computed by the formulae

$$F'(x) = \sum_{\nu} f_{\nu} M_{k}'(x - \nu, t), \qquad (31')$$

$$F''(x) = \sum_{\nu} f_{\nu} M_{k}''(x - \nu, t), \qquad (31'')$$

from corresponding tables of M_k' and M_k'' .

4.33. The least squares origin of formula (20). We want to sketch briefly the genesis of our formula (20). Let the sequence $\{y_n\}$ be given and consider the spline curve F(x) given by (31), where the coefficients $\{f_n\}$ are as yet unknown. If we try to determine these unknowns by the requirement that F(x) should interpolate strictly the given ordinates y_n , i.e.,

$$F(n) = y_n \qquad (n = 0, \pm 1, \pm 2, \cdots),$$
 (32)

we obtain an infinite system of linear equations in the unknown f_r , the solution of which was found to be given by

$$f_{\nu} = \sum_{n=-\infty}^{\infty} y_{\nu} \omega_{\nu-n}^{(k)}(t, 0).$$

This leads to our ordinary interpolation formula (11).

In view of Whittaker's well known smoothing method it seemed natural to proceed now as follows: Let ϵ be a given positive number. To determine the unknown coefficients f, of (31) as solutions of the following minimal problem, we set

$$\sum_{n} (F(n) - y_n)^2 + \epsilon \cdot \sum_{n} (f_n - y_r)^2 = \text{minimum}.$$
 (33)

For $\epsilon=0$ the solution is of course identical with the solution of the ordinary interpolation problem (32). For $\epsilon=\infty$ the solution is obviously $f_n=y_n$ in which case (31) reduces to (8). For $0 \le \epsilon \le \infty$ a system of "normal equations" arises whose solution is found to be given by (30). The explicit solution of these normal equations (matrix inversion) is performed by the numerical determination of the cosine coefficients ω , of the expansion (28) for each given set of values of k, t and ϵ .

V. THE COMPUTATION OF THE TABLES I, II, III

In this last chapter we shall discuss the methods used in the computation of our tables which allow us to use our formulae (30), (31) or

$$f_n = \sum_{r=-\infty}^{\infty} y_r \omega_{n-r}^{(k)}(t, \epsilon), \qquad (1)$$

$$F(x) = \sum_{n=-\infty}^{\infty} f_n M_k(x-n, t), \qquad (2)$$

for subtabulation to tenths.

5.1. The computation of the function $M_k(x, t)$ and its derivatives. This function is defined (see III(37)) by the integral

$$M_k(x, t) = \frac{1}{2\pi} \int_{-\infty}^{\infty} e^{-t(u/2)^2} \left(\frac{2 \sin u/2}{u} \right)^k e^{iux} du, \qquad (t > 0).$$
 (3)

For the special case of t=0 and $k=1, 2, 3, \cdots$ we found previously the explicit polynomial expressions III(3). It now so happens that for our present case of t>0 (3) allows us to define our function also for k=0 as

$$M_0(x, t) = \frac{1}{2\pi} \int_{-\infty}^{\infty} e^{-t(u/2)^2} e^{iux} du.$$

This last integral is known to be identical to

$$M_0(x, t) = \frac{1}{\sqrt{\pi t}} e^{-x^2/t}.$$
 (4)

The recurrence relation III(40) shows that (3) is obtained from (4) by repeating k times the averaging operation

$$\int_{x-1/2}^{x+1/2} \qquad \text{or} \qquad \delta \int_{-\infty}^{x}.$$

The result, however, is not changed if we perform all k integrations first to be followed by the operation δ^k of kth central differencing. This proves the following result: If we define a sequence of functions $g_k(x, t)$ by

$$g_0(x, t) = \frac{1}{\sqrt{\pi t}} e^{-x^2/t}$$
 (5)

and the recurrence relation

$$g_k(x, t) = \int_{-\infty}^x g_{k-1}(x, t) dx \qquad (k = 1, 2, 3, \cdots),$$
 (6)

then

$$M_k(x,t) = \delta^k g_k(x,t). \tag{7}$$

This relation reduces the problem to the problem of computing the repeated integral $g_k(x, t)$ of the error function (5). This we do as follows. It is easy to prove by induction or otherwise that (5) and (6) imply

$$g_k(x,t) = \frac{1}{(k-1)!} \frac{1}{\sqrt{\pi t}} \int_{-\infty}^x (x-u)^{k-1} e^{-u^2/t} du.$$
 (8)

With x-u=v this becomes

$$g_k(x, t) = \frac{1}{(k-1)!} \frac{1}{\sqrt{\pi t}} \int_0^\infty e^{-(x-v)^2/t} v^{k-1} dv.$$
 (9)

By differentiating this with respect to x we get

$$g_{k}'(x, t) = \frac{1}{(k-1)!} \frac{1}{\sqrt{\pi t}} \int_{0}^{\infty} e^{-(x-r)^{2}/t} v^{k-1} (-2xt^{-1} + 2vt^{-1}) dv$$
$$= -\frac{2x}{t} g_{k}(x, t) + \frac{2k}{t} g_{k+1}(x, t)$$

and therefore the recurrence relation

$$g_{k+1}(x, t) = \frac{t}{2k} g_k'(x, t) + \frac{x}{k} g_k(x, t), \qquad (k = 1, 2, \cdots)$$
 (10)

which allows us to compute the successive values $g_k(x, t)$ by the operation of differentiation rather than integration. Indeed from (5) and (6) for k=1 we get

$$g_1(x, t) = \frac{1}{\sqrt{\pi t}} \int_{-\infty}^{x} e^{-x^2/t} dx.$$
 (11)

Now (11) and (10) for k=1 will give

$$g_2(x, t) = \frac{t}{2} \frac{1}{\sqrt{\pi t}} e^{-x^2/t} + x \frac{1}{\sqrt{\pi t}} \int_{-\infty}^{x} e^{-x^2/t} dx$$

from which $g_3(x, t)$ is readily determined.

This progressive computation is greatly simplified if we realize that $g_k(x, t)$ will appear as an expression of the form

$$g_k(x, t) = P_k(x, t)g_0(x, t) + Q_k(x, t)g_1(x, t), \qquad (12)$$

where P_k , Q_k are polynomials in x and t, while $g_0(x, t)$ is the error function (5) and $g_1(x, t)$ is the error integral (11). Substituting (12) into (10) we find

$$g_{k+1}(x,t) = \frac{t}{2k} (P'_k + Q_k) g_0(x,t) + \left(\frac{t}{2k} Q'_k + \frac{x}{k} Q_k \right) g_1(x,t).$$

On comparing with (12) for k+1, rather than k, we obtain the recurrence relations

$$P_{k+1} = \frac{t}{2k} (P_k' + Q_k)$$

$$Q_{k+1} = \frac{t}{2k} Q_k' + \frac{x}{k} Q_k \qquad (k = 1, 2, \cdots).$$
(13)

Since $P_1=0$, $Q_1=1$ we readily obtain the following explicit expressions

$$P_{2} = t/2, Q_{2} = x,$$

$$P_{3} = tx/4, Q_{3} = t/4 + x^{2}/2,$$

$$P_{4} = t(t + x^{2})/12, Q_{4} = x(3t + 2x^{2})/12, (14)$$

$$P_{5} = tx(5t + 2x^{2})/96, Q_{5} = (3t^{2} + 12tx^{2} + 4x^{4})/96,$$

$$P_{6} = t(4t^{2} + 9tx^{2} + 2x^{4})/480, Q_{6} = x(15t^{2} + 20tx^{2} + 4x^{4})/480.$$

Excellent tables of the probability function (5) and its integral (11) are now available.

By means of these tables the formulae (12) and (14) allow us to compute readily the function $g_k(x, t)$. It seems worth while to point out that the relation (7) goes over into III(8) if $t \to +0$. Indeed by an obvious change of variable we see that (11) becomes

$$g_1(x, t) = \frac{1}{\sqrt{\pi}} \int_{-\infty}^{x/\sqrt{t}} e^{-u^2} du$$

and therefore

$$\lim_{t \to +0} g_1(x, t) = x_+^0.$$

Now by induction we prove by (6), on letting $t \rightarrow +0$, that

$$\lim_{t\to+0} g_k(x, t) = \frac{1}{(k-1)!} x_+^{k-1}$$

which proves our last statement by continuity.

The computation of the derivatives of $M_k(x, t)$ is immediately settled by the relation

$$M_k^{(r)}(x, t) = \delta^k g_{k-r}(x, t),$$
 (15)

which is implied by (6).

5.2. The computation of the cosine coefficients $\omega_n^{(k)}(t, \epsilon)$. By IV(5) and IV(28) we can see that the problem consists in computing the values of the coefficients of the cosine expansion of the function

$$\Omega_k(u, t, \epsilon) = \frac{\epsilon + \phi_k(u, t)}{\epsilon + \phi_k(u, t)^2} = \sum_{n=-\infty}^{\infty} \omega_n^{(k)}(t, \epsilon) \cos nu, \tag{16}$$

where the even periodic function $\phi_k(u, t)$ is defined by its cosine expansion

$$\phi_k(u, t) = \sum_{n=-\infty}^{\infty} M_k(n, t) \cos nu.$$
 (17)

¹⁴ I owe to D. H. Lehmer the reference to the functions $Hh_n(x)$ defined by

$$Hh_0(x) = \int_{-\pi}^{\infty} e^{-x^2/2} dx, \qquad Hh_n(x) = \int_{-\pi}^{\infty} Hh_{n-1}(x) dx.$$

Tables of these functions were published by J. R. Airey as Tables XV, Group IV, of the Mathematical Tables of the British Association for the Advancement of Science. The relation between our $g_k(x, t)$ and these new functions is

$$g_k(x,t) = \frac{1}{\sqrt{2\pi}} (t/2)^{(k-1)/2} H h_{k-1}(-x\sqrt{2/t}).$$

This relation, for k=4, $t=\frac{1}{2}$, would readily allow us to compute our Table I by means of Airey's tables of Hh_3 , Hh_2 and Hh_1 . However, for other sets of values of k and t, such as k=8, $t=\frac{1}{4}$, which are needed for other purposes, the range of x in Airey's table becomes insufficient. In this case tables of $M_k(x, t)$ and its derivatives are computed by our formula (12) and the excellent Tables of Probability Functions, vol. I (1941), vol. II (1942), prepared by the Mathematical Tables Project under the direction of A. N. Lowan.

The coefficients $M_k(n,t)$ of this extremely fast convergent series are readily computed to 10 decimal places. The obvious procedure would be to compute from (17) a table of $\phi_k(u,t)$, then compute a similar table of $\Omega_k(u,t,\epsilon)$ which is then to be used in computing ω_n by some method of numerical harmonic analysis. It would be hard to achieve accuracy by this method and for this reason we proceeded differently. It should be born in mind that the cosine expansion of the denominator of (16) is readily obtained by the simple operation of multiplication of Fourier series. The only troublesome part is the computation of the expansion

$$\frac{1}{\epsilon + \phi_k(u, t)^2} = \sum_{-\infty}^{\infty} c_n \cos nu, \qquad (18)$$

i.e., the reciprocation of a given cosine series. This was done as follows. The above-mentioned method of a 24-ordinate harmonic analysis scheme was used for obtaining values of the c_n 's accurate to 4-5 decimal places. These values were then improved to values accurate to 8 or 9 places by an iteration method developed by H. A. Rademacher and the author. This method is closely related to the method recommended by H. Hotelling for the reciprocation of ordinary matrices and will be described elsewhere.

In concluding this paper we want to point out two special cases of our ordinary interpolation formula (11), or (20) for $\epsilon = 0$, which are of mathematical interest. We mention first the case of k = 0, t > 0. This corresponds to interpolating our ordinates y_n by means of a function F(x) as described by the formula (8) of the Introduction. Although, as remarked there, the resulting interpolation formula is useless for practical purposes, it has the remarkable feature that the expansion coefficients $\omega_n^{(0)}(t, 0)$ of (16) may be obtained explicitly. Indeed the function $\phi_0(u, t)$ reduces to a Theta function which is a regular and uniform function of

$$z = e^{iu}$$

with singularities only at z=0 and $z=\infty$. The simple zeros of this function are real, negative and form a geometric progression. As a result we are able to find explicitly the decomposition in partial fractions of the reciprocal

$$1/\phi_0(u, t)$$
.

The expansion of these partial fractions into geometric power series furnishes explicitly the Laurent expansion in powers of z and therefore also the cosine expansion (16).

The second special case of interest is k>0, t=0. In this case our formula (11) reduces to an ordinary polynomial interpolation formula of degree k-1 and class k-2. This does not contradict Mr. Greville's statement (loc. cit. page 212) to the effect that such formulae do not exist. Indeed Mr. Greville considers only basic polynomial functions L(x) of finite span s only, while our basic $L_k(x,0)$ are of infinite span. This case, which is of considerable interest, requires a more detailed investigation of the cosine polynomials $\phi_k(u,0)$. We postpone this discussion to the second part B of this paper.

APPENDIX

Description of the tables and their use for the analytic approximation of equidistant data.

Tables I and II. In Table I we find the 8-place values of the even function

$$M(x) = \frac{1}{2\pi} \int_{-\infty}^{\infty} e^{-u^2/8} \left(\frac{2 \sin u/2}{u} \right)^4 \cos ux du$$
 (1)

and its derivatives M'(x), M''(x) for the step of $\Delta x = 0.1$. The graph of M(x) is a bell-shaped curve and M(x) vanishes to 8 places for $x \le -4.3$ and $x \ge 4.3$. We now define a function of period 2π by the cosine series

$$\phi(u) = M(0) + 2M(1)\cos u + 2M(2)\cos 2u + \cdots$$
 (2)

and expand in cosine series the following functions

$$\frac{\epsilon + \phi(u)}{\epsilon + \phi(u)^2} = \omega_0(\epsilon) + 2\omega_1(\epsilon) \cos u + 2\omega_2(\epsilon) \cos 2u + \cdots, \qquad (3)$$

where ϵ is a non-negative parameter. Our Table II gives the 8-plane values of these coefficients for $\epsilon = 0, 0.1, 0.2, \dots, 1.0$.

These tables may be used as follows to obtain an analytic approximation F(x) to our ordinates y_n . We discuss first the case when F(x) is to interpolate the ordinates, in the usual sense, i.e.,

$$F(n) = y_n. (4)$$

For this end we compute first from the sequence $\{y_n\}$ a new sequence of coefficients $\{f_n\}$ by means of the formula

$$f_r = \cdots + y_{n-2}\omega_2(0) + y_{n-1}\omega_1(0) + y_n\omega_0(0) + y_{n+1}\omega_1(0) + y_{n+2}\omega_2(0) + \cdots$$
 (5)

or

$$f_n = \sum_{\mathbf{r}} y_{\mathbf{r}} \omega_{n-\mathbf{r}}(0), \tag{5'}$$

where $\omega_m = \omega_{-m}$. The analytic approximation of the ordinates y_n is then given by

$$F(x) = \sum_{n} f_n M(x - n). \tag{6}$$

The values of F(x), x to even tenths, are now readily computed. Thus

$$F(2.3) = f_{-1}M(3.3) + f_{0}M(2.3) + f_{1}M(1.3) + f_{2}M(0.3) + f_{3}M(-1+.3) + f_{4}M(-2+.3) + f_{5}M(-3+.3) + f_{6}M(-4+.3).$$

The tabular values of M(x) are so arranged that all 8 values needed in this computation are found in the fourth column headed x+.3. Generally, if the values of f_n are written in a vertical column, we compute the values of $F(m+\nu\cdot 10^{-1})$ ($\nu=0,1,\cdots,9$) by matching the column of values of f_n with the ν th column of the table of M(x) in such a way that f_m corresponds to the row for x=0. The products

$$f_n M(m-n+\nu\cdot 10^{-1})$$

are then accumulated in the products counter of a desk computing machine. Also the values f_n are best computed by (5') in a similar way if the column of values of $\omega_n(0)$ is extended upwards by symmetry for negative values of n.

From the tables of M'(x) and M''(x) we may likewise compute tables of the derivatives of F(x) by

$$F^{(r)}(x) = \sum_{n} f_n M^{(r)}(x-n). \tag{7}$$

A check of the computation of the coefficients f_n is afforded by (4). Indeed the values F(n) computed by (6) should agree with the y_n to about eight significant figures.

The formula (6) is exact for cubics, i.e., if the y_n are the ordinates of a polynomial of degree at most 3, then F(x) is identical with that polynomial.

If the conditions (4) of strict interpolation are not required, then we have the possibility of obtaining an approximation F(x) which is such that the sequence $\{F(n)\}$ is smoother than the given $\{y_n\}$. The approximation F(x) is then given by the pair of formulae

$$f_n = \sum_{\mathbf{r}} y_{\mathbf{r}} \omega_{n-\mathbf{r}}(\epsilon), \tag{8}$$

$$\dot{F}(x) = \sum_{n} f_n M(x - n), \qquad (9)$$

which are applied as above. The choice of the value of the smoothing parameter ϵ depends on the amount of smoothing desired. The strongest smoothing afforded by our table is obtained for $\epsilon = +\infty$. Then (3) shows that $\omega_0(\infty) = 1$, $\omega_1(\infty) = \omega_2(\infty) = \cdots = 0$. Thus (8) becomes $f_n = y_n$ and (9) reduces to

$$F(x) = \sum_{n} y_n M(x - n). \tag{10}$$

This formula is especially simple to apply. It should be remarked however that, if $\epsilon > 0$, our formula (9) is exact only for linear functions and the same is true of (10).

Table III. We may eliminate the coefficients f_n between (8) and (9). In terms of the new even function

$$L(x, \epsilon) = \sum_{n=-\infty}^{\infty} \omega_n(\epsilon) M(x - n), \qquad (11)$$

our formulae (8), (9), then reduce to

$$F(x) = \sum_{n} y_n L(x - n, \epsilon). \tag{12}$$

Table III gives the values of $L(x, \epsilon)$ and $L''(x, \epsilon)$ for $\epsilon = 0, 0.1, \dots, 1.0$ for the step $\Delta x = 0.5$. These may be used for subtabulation to halves in preference to (5), (6) or (8), (9). For subtabulation to fifths or tens, the use of formulae (8), (9) is preferable because of the slower damping of the function $L(x, \epsilon)$. Even so, formula (12) and Table III allow us to estimate quickly how well F(x) approximates the y_n . By (12) we have

$$F''(x) = \sum_{n} y_n L''(x - n, \epsilon). \tag{13}$$

The table of $L''(x, \epsilon)$ then allows us to compute quickly a table of F''(x) for the step $\Delta x = 0.5$ or else only isolated values if such are needed.

Example of subtabulation to tenths.	We consider the following fairly smooth se-
quence of 64 ordinates y_n :	

n	y _n	n	y _n	n	y_n	n	y_n	n	у"	n	y_n
1	24614	12	25370	23	29290	34	73820	45	82450	56	79962
2	24644	13	25504	24	30160	35	77830	46	82290	57	79698
3	24680	14	25660	25	31320	36	80240	47	82110	58	79431
4	24723	15	25850	26	32840	- 37	81660	48	81911	59	79161
5	24772	16	26080	27	34790	38	82330	49	81699	60	78889
6	24828	17	26350	28	37260	39	82680	50	81472	61	78614
7	24892	18	26660	29	40440	40	82840	51	81234	62	78338
8	24966	19	27040	30	44750	41	82830	52	80987	63	78060
9	25048	20	27490	31	51120	42	82780	53	80736	64	77780
10	25143	21	28010	32	59390	43	82700	54	80481	İ	
11	25250	22	28600	33	67550	44	82590	55	80223		

The differences of the section of this table with which we will be concerned are as follows:

n	y_n	Δ	Δ^2	Δ3	Δ^4 .	Δ5
27	34790					
28	37260	2470		:		
29	40440	3180	710			
30	44750	4310	1130	420		
31	51120	6370	2060	930	510	
32	59390	8270	1900	- 160	-1090	-1600
33	67550	8160	- 110	-2010	-1850	- 760
34	73820	6270	-1890	-1780	230	2080
35	77830	4010	-2260	- 370	1410	1180
36	80240	2410	-1600	660	1030	- 380
37	81660	1420	- 990	610	– 50	-1080
38	82330	670	– 750	240	– 370	- 320

We illustrate the case of strict interpolation, i.e., we use our Tables II for $\epsilon = 0$. From our formula (5) and the values of ω_n as given in the column of Table II, with the heading $\epsilon = 0$, we obtain the following coefficients.

n	f_n
27	34662.222
28	37031.355
29	40215.195
30	44060.182
31	50349.304
32	59490.524
33	68212.510
34	74566.216
35	78283.074
36	80460.234
37	81953.811
38	82356.888

From these values and our Table I of M(x) and M''(x), we obtain by the formulae (6) and (7) the following tables of F(x) and F''(x) with their differences.

Table of the function $F(x)$ and of its second derivative $F''(x)$	able of the function	F(x) and	l of its second	derivative I	F''(x).
--	----------------------	----------	-----------------	--------------	---------

x	F(x)	Δ	Δ^2	Δ^3	Δ4	$F^{\prime\prime}(x)$	Δ	Δ^2	Δ^3	Δ4
31.0	51120.00					2117.97				
31.1	51884.17	76417				1966.48	-15149			
31.2	52667.97	78380	1963			1787.44	-17904	-2755		
31.3	53469.63	80166	1786	-177		1583.71	-20373	-2469	286	
31.4	54287.11	81748	1582	-204	-27	1359.15	-22456	-2083	386	100
31.5	55118.17	83106	1358	-224	-20	1118.30	-24085	-1629	454	68
31.6	55960.40	84223	1117	-241	-17	866.08	-25222	-1137	492	38
31.7	56811.29	85089	866	-251	-10	607.04	-25868	- 646	491	- 1
31.8	57668.25	85696	607	-259	- 8	346.89	-26051	- 183	463	-28
31.9	58528.68	86043	347	-260	- 1	88.63	-25826	225	408	-55
32.0	59390.00	86132	89	-258	2	- 163.98	-25261	565	340	-68
32.1	60249.69	85969	- 163	-252	6	- 408.22	-24424	837	272	-68
32.2	61105.30	85561	- 408	-245	7	- 642.14	-23392	1032	195	-77
32.3	61954.51	84921	- 640	-232	13	- 864.26	-22212	1180	148	-47
32.4	62795.08	84057	- 864	-224	8	-1073.51	-20925	1287	107	-41
32.5	63624.93	82985	-1072	-208	16	-1269.11	-19560	1365	78	-29
32.6	64442.10	81717	-1268	-196	12	-1450.39	-18128	1432	67	-11
32.7	65244.77	80267	-1450	-182	14	-1616.76	-16637	1491	59	- 8
32.8	66031.30	78653	-1614	-164	18	-1767.70	-15094	1543	52	- 7
32.9	66800.16	76886	-1767	-153	11	-1902.77	-13507	1587	44	- 8
33.0	67550.00	74984	-1902	-135	18	-2021.68	-11891	1616	29	-15
33.1	68279.64	72964	-2020	-118	17	-2124.30	-10262	1629	13	-16
33.2	68988.05	70841	-2123	-103	15	-2210.71	- 8641	1621	- 8	-21
33.3	69674.37	68632	-2209	- 86	17	-2281.13	- 7042	1599	-22	-14
33.4	70337.91	65354	-2278	- 69	17	-2335.91	- 5478	1564	-35	-13
33.5	70978.07	64016	-2338	- 60	9	-2375.46	- 3955	1523	-41	- 6
33.6	71594.50	61643	-2373	- 35	25	-2400.17	- 2471	1484	-39	2
33.7	72186.94	59244	-2399	- 26	9	-2410.41	- 1024	1447	-37	2
33.8	72755.29	56835	-2409	- 10	16	-2406.55	386	1410	-37	0
33.9	73299.58	54429	-2406	3	13	-2389.01	1754	1368	-42	- 5
34.0	73820.00	52042	-2387	19	16	-2358.32	3069	1315	-53	-11

An inspection of these tables shows that they are very smooth and that they define F(x) and F''(x) to 7 significant figures by 4-point central interpolation. We have chosen on purpose an example for which it would be hard to obtain similar results by standard methods, if we are to maintain the forced accuracy requirement, and the same high degree of consistency between the function F(x) and its second derivative F''(x). For purposes of comparison we show also the interpolated values $F_c(x)$ for the range x=31.6-32.5 obtained by the 10-point central interpolation method. On comparing with our table of F(x) we notice that

$$F_c(x) < F(x)$$

throughout this range, with the exception of the point x=32.0 where, of course, both values agree. The curve $F_c(x)$ has a corner at x=32. This is the typical discontinuity in the first derivative due to central interpolation methods (see the first paragraph of our Introduction).

x	$F_c(x)$	Δ	Δ^2	Δ^3	Δ^4
31.6	55959.90				
31.7	56810.60	85070			
31.8	57667.55	85695	625		
31.9	58528.22	86067	372	-253	
32.0	59390.00	86178	111	-261	- 8
32.1	60248.72	85872	- 306	-417	-156
32.2	61103.61	85489	- 383	- 77	340
32.3	61952.37	84876	- 613	-230	-153
32.4	62792.77	84040	- 836	-223	7
32.5	63622.68	82991	-1049	-213	10

Notice that we needed 12 coefficients f_n for the subtabulation of three panels. Each additional coefficient f_n ($n=39, 40, \cdots$) allows the subtabulation of an additional panel.

It should be remarked that 53 ordinates y_n enter into the computation of each coefficient f_n . This is due to the slow rate of damping of the $\omega_n(\epsilon)$ for $\epsilon = 0$. Thus for $\epsilon = .1$ (very moderate smoothing) only 35 ordinates y_n are needed, for $\epsilon = 1.0$ only 23, for $\epsilon = \infty$ only 1. Concerning the important matter of dealing with the ends of a table see section 1.2 and the last paragraph of section 4.31.

Table I: $M_k(x, t)$, $M'_k(x, t)$, $M''_k(x, t)$ for k = 4, t = 0.5, $\Delta x = 0.1$. $M_4(x, 1/2)$

x	x+0	x+.1	x+.2	x+.3	x+.4
4	.0000004	.00000002	.0000001		
3	.00011325	.00005910	.00002991	.00001467	.00000697
2	.01616917	.01105340	.00737858	.00480621	.00305258
1	.22597004	.18940616	.15590118	.12596479	.09986387
0	.51549499	.51132566	.49901141	.47911917	.45254731
-1	.22597004	.26483185	.30499058	.34523755	.33420963
-2	.01616917	.02311310	.03230776	.04418973	.05917998
-3	.00011325	.00021062	.00038032	.00066726	.00113822
-4	.0000004	.00000010	.00000026	.00000062	.00000143
x	x+.5	x+.6	x+.7	x+.8	x+.9
3	.00000321	.00000143	.0000062	.0000026	.00000010
2	.00188907	.00113822	.00066726	.00038032	.00021062
1	.07764689	.05917998	.04418973	.03230776	.02311310
0	.42046084	.38420963	.34523755	.30499058	.26483185
-1	.42046084	.45254731	.47911917	.49901141	.51132566
-2	.07764689	.09986387	.12596479	.15590118	.18940616
-3	.00188907	.00305258	.00480621	.00737858	.01105340
-4	.00000321	.00000697	.00001467	.00002991	.00005910
-5				.0000001	.00000002

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 $M_4'(x, 1/2)$

		·····			
x	x+0	x+.1	x+.2	x+.3	x+.4
4	00000039	00000015	0000006	00000002	00000001
3	00071955	00039340	00020833	00010680	00005298
2	05961795	04334506	03071644	02120376	01424920
1	37860391	35140346	31784825	28043885	24150489
0	.00000000	08306134	16227165	23406492	29541674
-1	.37860391	.39695855	.40419276	.39846265	.37855467
-2	.05961795	.07996844	.10465732	.13368990	.16673619
-3	.00071955	.00127546	.00219236	.00365652	.00592117
-4	.00000039	.0000096	.00000229	.00000529	.00001179
x	x+.5	x+.6	x+.7	x+.8	x+.9
3	00002542	00001179	00000529	00000229	00000096
2	00931577	00592117	00365652	00219236	00217546
1	20306520	16673619	13368990	10465732	07996844
0	34404758	37855467	39846265	40419276	39695855
-1	.34404758	.29541674	.23406492	.16227165	.08306134
-2	.20306520	.24150489	.28043885	.31784825	.35140346
-3	.00931577	.01424920	.02120376	.03071644	.04334506
-4	.00002542	.00005298	.00010680	.00020833	.00039340
-5		.00000001	.00000002	.00000006	.0000015

$M_4^{\prime\prime}(x, 1/2)$

x	x+.0	x+.1	x+.2	x+.3	x+.4
4	.00000357	.00000145	.0000056	.00000021	.0000008
3	.00423106	.00243772	.00135797	.00073109	.00038024
2	.18251117	.14368197	.10978191	.08140988	.05858190
1	.23181861	.30800376	.35890239	.38537940	.38991971
0	83712882	81763132	76058819	67020231	55301267
-1	.23181861	.13144694	.01013023	12678241	27209706
-2	.18251117	.22494722	.26885281	.31126005	.34845442
-3	.00423106	.00710375	.01154277	.01816077	.02768079
-4	.00000357	.00000851	.00001955	.00004332	.00009259
-5					.0000001
x	x+.5	x+.6	x+.7	x+.8	x+.9
4	.0000003	.0000001			
3	.00019097	.00009259	.00004332	.00001955	.00000851
2	.04089359	.02768079	.01816077	.01154277	.00710375
1	.37617315	.34845442	.31126005	.26885281	.22494722
0	41725773	27209706	12678241	.01013023	.13144694
-1	41725773	55301267	67020231	76058819	81763132
-2	.37617315	.38991971	.38537940	.35890239	.30800376
-3	.04089359	.05858190	.08140988	.10978191	.14368197
-4	.00019097	.00038024	.00073109	.00135797	.00243772
-5	.00000003	.00000008	.00000021	.00000056	.00000145

Table II: $\omega_n^{(k)}(t, \epsilon)$ for $k=4, t=0.5, \epsilon=0$ (0.1) 1.0.

n	€=.0	ε=.1	ε=.2	ϵ =.3	ε=.4
0 1 2 3 4 5 6 7 8 9	 ε=.0 3.50637741 -1.84900618 .87238793 40443570 .18693997 08636451 .03989615 01842978 .00851350 00393275 .00181670 	ε=.1 1.613786532689092908981772 .0702789102078617 .00133949 .0016923400088114 .00019734 .0000107300002625	$\begin{array}{c} \epsilon = .2 \\ \hline 1.39953009 \\14132793 \\09332063 \\ .04023694 \\00397484 \\00223908 \\ .00099749 \\00010447 \\00005372 \\ .00002469 \\00000273 \\ \hline \end{array}$	$\begin{array}{c} \epsilon = .3 \\ \hline 1.30308904 \\09293505 \\08242675 \\ .02480160 \\ .00050538 \\00188468 \\ .00037463 \\ .00005298 \\00003828 \\ .0000455 \\ .0000174 \\ \end{array}$	$\begin{array}{c} \epsilon = .4 \\ \hline & 1.24631521 \\06784110 \\07223261 \\ .01624479 \\ .00184671 \\00132999 \\ .00010684 \\ .00006541 \\00001761 \\00000130 \\ \end{array}$
11 12 13 14 15 16 17 18 19 20 21 22	00083921 .00038767 00017908 .00008272 00003821 .00001765 00000815 .00000377 00000174 .00000080 00000037	00002625 .00001022 00000156 00000044 .00000036 00000011 .00000001	00000273 00000129 .00000061 •00000007 00000003 .00000002	00000174 00000070 .00000003 .00000004 00000001	.00000130 00000014 00000006 .00000002
23 24 25 26	00000008 .00000004 00000002 .00000001				

n	ϵ =.5	€=.6	ϵ =.7	ϵ = .8	€=.9	ϵ = 1.0
0	1.20834767	1.18095463	1.16016154	1.14379093	1.13054096	1.11958158
1	05268720	04264921	03556878	03034057	02634263	02319971
2	06387537	05710538	05156939	04698035	04312407	03984269
3	.01107108	.00773445	.00547641	.00389078	.00274451	.00189634
4	.00219079	.00218246	.00204868	.00187682	.00170183	.00153738
5	00091344	00062674	00043120	00029659	00020265	00013620
6	00000351	00004704	00006163	00006358	00006018	00005476
7	.00005180	.00003700	.00002545	.00001716	.00001138	.00000739
8	00000656	00000140	.00000085	.00000171	.00000193	.00000187
9	00000206	00000175	00000127	00000087	00000057	00000036
10	.00000064	.00000025	.00000006	00000002	00000005	00000006
11	.00000003	.00000006	.00000006	.00000004	.00000002	.00000001
12	00000004	00000002	00000001			

Table III: $L_k(x, t, \epsilon)$, $L_k''(x, t, \epsilon)$ for $k = 4, t = 0.5, \epsilon = 0$ (0.1) 1.0, $\Delta x = 0.5$. $L_4(x, 1/2, \epsilon)$

					,
<i>x</i>	$\epsilon = .0$	€=.1	ε=.2	ε=.3	€=.4
0.0	1.00000000	.70747935	.65457028	.62707488	.60947694
0.5	.62191163	.53757743	.510 70485	.49509729	.48452022
1.0	.00000000	.20252568	.22066478	.22681461	.22949350
1.5	17291085	02061576	.01285810	.02919893	.03901344
2.0	.00000000	06545791	04840114	03681939	02872086
2.5	.07415615	02765903	03096280	02894823	02631330
3.0	.00000000	.00709183	003406 67	00711221	00850828
3.5	03382251	.01344008	.00756627	.00392340	.00177090
4.0	.00000000	.00401304	.00502 86 2	.00410188	.00314843
4.5	.01558996	00276042	.00041 20 8	.00121901	.00135036
5.0	.00000000	00251219	00118870	00038015	.00001138
5.5	00719897	00027479	00076318	00054505	00033539
6.0	.00000000	.00065102	00007596	00021043	00019927
6.5	.00332530	.00042139	.00019012	.00003152	00002867
7.0	.00000000	00000773	.00012316	.00007297	.00003257
7.5	00153608	00015286	.00000861	.00003207	.00002580
8.0	.00000000	00006787	00002989	00000086	.00000704
8.5	.00070958	.00002025	00001865	00000923	00000251
9.0	.00000000	.00003031	00000162	00000502	00000321
9.5	00032779	.00000793	.00000477	00000028	00000120
10.0	.00000000	00000573	.00000301	.00000115	.00000010
10.5	.00015142	00000566	.00000017	.00000072	.00000036
11.0	.00000000	00000083	00000075	.00000011	.00000018
11.5	00006995	.00000159	00000045	0000014	.0000001
12.0	.00000000	.00000099	00000003	00000011	00000004
12.5	.00003231	00000007	.00000012	00000002	00000002
13.0	.00000000	00000034	.00000007	.00000001	00000001
13.5	00001492	00000014	.00000000	.00000001	
14.0	.00000000	.00000004	00000002		
14.5	.00000690	.00000007	00000001		
15.0	.00000000	.00000002			
15.5	00000318	0000001			
16.0	.00000000	00000001			
16.5	.00000147				
17.0	.00000000				
17.5	00000068				
18.0	.00000000				
18.5	.00000031				
19.0	.00000000				
19.5	00000014				
20.0	.00000000				
20.5	.00000007				
21.0	.00000000				
21.5	00000003				
22.0	.00000000				
22.5	.0000001				
23.0	.00000000				
23.5	00000001				

 $L_4(x, 1/2, \epsilon)$

x	ϵ = .5	ε=.6	ε = .7	ε =.8	$\epsilon = .9$	$\epsilon = 1.0$
0.0	.59702260	.58765637	.58031608	.57438799	.56948898	.56536580
0.5	.47675954	.47077398	.46599416	.46207717	.45880202	.45601892
1.0	.23077657	.23140004	.23168090	.23177314	.23175789	.23168050
1.5	.04557847	.05027848	.05380648	.05654957	.05874137	.06053136
2.0	02276409	01820178	01459584	01167397	00925829	00722771
2.5	02384227	02167108	01979233	01816756	01675611	01552233
3.0	00896161	00898986	00881784	00855221	00824659	00792883
3.5	.00044979	00038991	00093726	00129962	00154092	00170083
4.0	.00238588	.00180229	.00135734	.00101562	.00075048	.00054256
4.5	.00127570	.00114308	.00100305	.00087278	.00075725	.00065681
5.0	.00019600	.00027865	.00030985	.00031471	.00030617	.00029109
5.5	00019071	00009654	00003598	.00000283	.00002756	.00004311
6.0	00015995	00012137	00008970	00006510	00004639	00003223
6.5	00004696	00004885	00004474	00003886	00003288	00002744
7.0	.00000987	00000179	00000738	00000973	00001039	00001018
7.5	.00001687	.00001000	.00000536	.00000238	.00000050	00000064
8.0	.00000771	.00000641	.00000486	.00000350	.00000244	.00000165
8.5	.00000044	.00000148	.00000168	.00000156	.00000134	.00000110
9.0	00000156	00000057	00000004	.00000021	.00000031	.00000034
9.5	00000101	00000067	00000039	00000020	00000009	00000002
10.0	00000023	00000027	00000022	00000017	00000011	00000008
10.5	.00000011	00000001	00000005	00000006	00000005	00000004
11.0	.00000012	.00000006	.00000002	.00000000	00000001	00000001
11.5	.00000004	.00000004	.00000002	.0000001	.00000001	
12.0	.00000000	.00000001	.00000001	.00000001		
12.5	00000001					
13.0	00000001					

 $L_4''(x, 1/2, \epsilon)$

x	ϵ = .0	ε=.1	$\epsilon = .2$	€=.3	$\epsilon = .4$
0.0	-3.47753764	-1.50781449	-1.27083552	-1.16381926	-1.10100908
0.5	-1.03983382	69689346	61542693	57326418	54670549
1.0	2.15613767	.54167607	.40225158	.34798919	.31925128
1.5	1.50655095	.77131824	.63355043	.56889199	.53067521
2.0	58680458	.31875073	.30878327	.29072626	.27601758
2.5	68097024	03482567	.02460402	.04246822	.04943501
3.0	.24590776	12647279	07651577	05154399	03726679
3.5	.31311773	06455381	05654901	04581150	03775297
4.0	11165611	.01678358	00530735	01047426	01153447
4.5	14452585	.03142765	.01425664	.00665986	.00297134
5.0	.05142591	.00673809	.00811324	.00596871	.00423710
5.5	.06675341	00655085	.00060896	.00183704	.00187944
6.0	02374375	- .00477107	00194355	00054832	.00001970
6.5	03083551	00059653	00138896	00087620	00050023
7.0	.01096729	.00133431	00011460	00030729	00026914
7.5	.01424417	.00097571	.00035809	.00005960	00003417
8.0	00506618	00005726	.00019854	.00010609	.00004375
8.5	00657998	00035828	.00001209	.00004959	.00003703
9.0	.00234028	00012112	00004884	00000116	.00000954
9.5	.00303957	.00004878	00003391	00001505	00000404
10.0	00108107	.00005884	00000242	00000732	00000433
10.5	00140411	.00001802	.00000898	00000026	000001 64
11.0	.00049939	00001229	.00000485	.00000168	.00000013
11.5	.00064862	00001316	.00000023	.00000113	.0000053
12.0	00023069	00000110	00000123	.00000016	.00000025
12.5	00029962	.00000374	00000083	00000023	.0000001
13.0	.00010657	.00000182	00000005	00000015	00000005
13.5	.00013841	00000018	.00000022	00000003	00000004
14.0	00004923	00000067	.00000012	.00000002	00000001
14.5	00006394	00000033	.00000000	.00000002	.0000001
15.0	.00002274	.00000009	00000003	.00000001	
15.5	.00002954	.0000016	00000002		
16.0	00001050	.00000003		ĺ	
16.5	00001364	00000003			
17.0	.00000485	00000002			
17.5	.0000630	.00000000	!		1
18.0	00000224	.0000001			
18.5	00000291				
19.0	.00000104				
19.5	.00000134				
20.0	00000048				
20.5	00000062				
21.0	.00000022				
21.5	.00000029				
22.0	00000010				1
22.5	00000013		1		
23.0	.00000005				
23.5	.00000006				1
24.0	00000002				
24.5	00000003				1
25.0	.0000001			İ	
25.5 26.0	0000001				
20.0	000001		1		

 L'_4 (x, 1/2, ϵ)

x	ϵ = .5	ε = .6	ε = .7	ϵ =.8	<i>ϵ</i> = .9	$\epsilon = 1.0$
0.0	-1.05919265	-1.02916420	-1.00647330	98868331	97433986	96251767
0.5	52821280	51450880	50390754	49544281	48851722	48273978
1.0	.30155959	.28962736	.28106624	.27464186	.26965348	.26567454
1.5	.50527188	.48711044	.47346009	.46281678	.45428116	.44728133
2.0	.26453429	.25546310	.24815810	.24216442	.23716440	.23293281
2.5	.05240385	.05363758	.05404202	.05402794	.05379802	.05345832
3.0	02823788	02210889	01772635	01446547	01196172	00998973
3.5	03182937	02737565	02393662	02121579	01901742	- .01720888
4.0	01135624	01078633	01011492	00944820	00882438	- .00825481
4.5	.00101034	00009918	00075259	00114593	00138383	00152531
5.0	.00303129	.00219629	.00160744	.00118299	.00087064	.00063651
5.5	.00166647	.00142136	.00120000	.00101295	.00085821	.00073079
6.0	.00024844	.00033324	.00035457	.00034759	.00032845	.00030479
6.5	00027461	00014145	00006202	00001410	.00001495	.00003245
7.0	00020347	00014764	00010563	00007505	00005291	00003686
7.5	00005788	00005841	00005187	00004389	00003637	00002987
8.0	.00001265	00000184	00000816	00001051	00001095	00001051
8.5	.00002301	.00001329	.00000717	.00000344	.00000121	00000014
9.0	.00000979	.00000777	.00000567	.00000399	.00000274	.00000184
9.5	.00000025	.00000163	.00000187	.00000172	.00000145	.00000117
10.0	00000199	00000071	00000008	.00000021	.00000032	.00000034
10.5	00000133	00000085	00000049	00000026	00000012	00000004
11.0	00000029	00000033	00000026	00000019	00000013	00000008
11.5	.00000016	.00000000	00000005	00000006	00000005	00000004
12.0	.00000015	.00000007	.00000002	.00000000	00000001	00000001
12.5	.00000005	.00000004	.00000003	.00000001	.00000001	
13.0	.00000000	.00000001	.00000001	.00000001		
13.5	00000002]	
14.0	00000001					