

## On the Association of Attributes in Statistics: With Illustrations from the Material of the Childhood Society, &c

G. Udny Yule

*Phil. Trans. R. Soc. Lond. A* 1900 **194**, 257-319

doi: 10.1098/rsta.1900.0019

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VII. *On the Association of Attributes in Statistics: with Illustrations from the Material of the Childhood Society, &c.*

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*Communicated by Professor KARL PEARSON, F.R.S.*

Received October 20,—Read December 7, 1899.

CONTENTS.

	Page.
I.—Introduction . . . . .	257
II.—General relations . . . . .	261
III.—Association . . . . .	270
IV.—Probable errors . . . . .	283
V.—Illustrations (A), miscellaneous . . . . .	288
VI.— „ (B), Association of defects in Children and Adults.	297

I.—INTRODUCTION.

§ 1. In the ordinary theory of statistical correlation, normal or otherwise, we are always supposed to be dealing with material susceptible of continuous variation, or at least of variation by a *considerable number* of discontinuous steps. The correlations of lengths or measurements on portions of the body form examples of the first kind; of numbers of children in families, petals or other parts of flowers, are examples of the second.

Certain practical cases arise, however, where either no variation is thinkable at all, or else is not measured or possibly measurable. We may class a number of individuals into deaf and not deaf, blind and not blind, imbecile and not imbecile, without attempting to go further (although gradations of deafness, blindness, and imbecility occur), and demand on the basis of the enumeration a discussion of the *association\** of the three infirmities. Or again the data may be the mortality from some disease with and without the administration of, say, a new antitoxin, the statistics giving

number who died to whom antitoxin was administered,  
 „ „ to whom antitoxin was not administered;

\* To distinguish it from the “correlation” of continuous variables.

number who did not die to whom antitoxin was not administered,  
 „ „ „ to whom antitoxin was administered;

and from these data a discussion of the value of the cure is required. Here there is no scale of “death”; there may be a scale of “antitoxin” if the dose varied, but not otherwise.

§ 2. Evidently such cases are of great importance, but the theory and means of handling them have received little attention from statisticians. Logicians have had a monopoly of the theory, but the superior interests of pure logic seem generally to have hindered them from developing it in a practical direction. The classical writings on the subject are, I suppose, those of DE MORGAN,\* BOOLE,† and JEVONS.‡ Without attempting to criticise the work of his predecessors, to both of whom he was of course greatly indebted, the method of the latter must be allowed to far exceed theirs in clearness and simplicity. BOOLE’S calculus of elective operators is highly complex in its working and necessitates the remembrance of many somewhat artificial rules; JEVONS’ method is practically intuitive. It is a matter of surprise to me that JEVONS never made any practical application of his method (so far as I am aware) during the decade or more that elapsed between the publication of his paper (*loc. cit.*) and his death. The following is a brief explanation of his notation and method.

§ 3. The symbols A, B, C, &c., are used to denote objects or individuals having the qualities A, B, C, &c. The terms enclosed in brackets thus—(A), (B), (C), &c., denote the *frequency* of individuals possessed of the quality or qualities A, B, or C, or the total number of such individuals observed in the given “universe of discourse.” § A compound term like AB denotes the class or group possessed of both qualities A and B, and (AB) its frequency; compound groups may occur with any number of specified qualities, *i.e.* (ABC), (ABCD), or (BDKMN). Corresponding to each positive term there is a negative term which we shall denote by a small Greek letter||  $\alpha$ ,  $\beta$ ,  $\gamma$ , &c. Thus  $\alpha$  signifies “not A,”  $\beta$  “not B,” and so on; and ( $\alpha$ ), ( $\beta$ ), &c., their frequencies. All symbols are used non-exclusively, A signifying objects *having the quality A with or without others*, and so on, consequently the frequency of any class can be expanded in terms of the frequencies of its sub-classes.

\* ‘Formal Logic,’ chap. VIII., “On the Numerically Definite Syllogism,” 1847.

† ‘Analysis of Logic,’ 1847. ‘Laws of Thought,’ 1854.

‡ “On a General System of Numerically Definite Reasoning,” ‘Memoirs of Manchester Literary and Philosophical Society,’ 1870. Reprinted in ‘Pure Logic and other Minor Works,’ Macmillan, 1890.

§ I have used this convenient term of the logicians for the “material discussed” throughout the paper. There seems no exact equivalent in ordinary statistical language.

|| I have substituted small Greek letters for JEVONS’ italics. Italics are rather troublesome when reading, as one has to spell out a group like  $A\beta cDE$ , “big A, little  $\beta$ , little  $c$ , big D, big E.” It is simpler to read  $A\beta\gamma DE$ . The Greek becomes more troublesome when many letters are wanted, owing to the non-correspondence of the alphabets, but this is not often of consequence.

Thus

$$\begin{aligned}
 (A) &= (AB) + (A\beta) \\
 &= (ABC) + (AB\gamma) + (A\beta C) + (A\beta\gamma) \\
 &= (ABCD) + (ABC\delta) + (AB\gamma D) + (A\beta\gamma\delta) \\
 &\quad + (A\beta CD) + (A\beta C\delta) + (A\beta\gamma D) + (A\beta\gamma\delta) \\
 &= \&c.
 \end{aligned}$$

and also if (U) be the total frequency (total number of observations, total number in the “universe of discourse”)

$$(U) = (A) + (\alpha) = (B) + (\beta) = (C) + (\gamma) = \&c.$$

The whole of JEVONS' method, so far as applied to purely numerical problems, depends on the use of equations of the above form, or the expansion of groups in terms of their sub-classes.

§ 4. We shall adopt the following conventions. When requiring to distinguish the qualities denoted by English letters from those denoted by Greek, we shall call the former *positive* qualities, the latter *negative*. A group in which all the qualities specified are positive will be called a positive group, and conversely.

A group specified by  $n$  qualities (positive or negative) will be termed an  $n$ th order group.

To distinguish the  $n$ th order groups in  $n$  variables from  $n$ th order groups formed from a larger number of variables, we shall refer to the former as “ultimate” groups.

Two groups such that each quality in the one is the negative (or *contrary*) of each quality in the other will be termed contrary groups, and their frequencies contrary frequencies. Thus

$$\begin{array}{ll}
 ABCD & \alpha\beta\gamma\delta \\
 \alpha BC & A\beta\gamma \\
 \alpha\beta\gamma DE & ABC\delta\epsilon
 \end{array}$$

are pairs of contraries. The case where the frequencies of contrary groups are equal is of some importance. This will be called the case of “equality of contraries.”

Consider, for example, the case of normally correlated continuous variables. If A denote the class in which some quality is above the average,  $\alpha$  the class in which the same is below\* average, and so on with B,  $\beta$ , &c., then from the symmetry of the surface we must have

\* Logically “not above average”; but we take the average as a mathematical point, so that there are no individuals with exactly average qualities.

$$\begin{aligned}
 (A) &= (a) \\
 (B) &= (\beta), \quad \&c., \\
 (AB) &= (a\beta) \\
 (aB) &= (A\beta), \quad \&c., \\
 (ABC) &= (a\beta\gamma) \\
 (AB\gamma) &= (a\beta C), \quad \&c.,
 \end{aligned}$$

and so on with groups of any order.

I shall return later to this case and to the properties that this equality of contraries produces.

§ 5. It may be noted at this point that groups may often be rapidly expanded by using ABC, &c., as “elective operators” in BOOLE’S sense, and using the general law of multiplication of operators, with the special conditions

$$UA = A,$$

*i.e.*, selecting out the universe of discourse, and then selecting out the A’s from it, is the same thing as selecting out the A’s at once, and the “index law”

$$A^n = A,$$

*i.e.*, repeating the operation of selecting out the A’s has no effect on the objects included.

To denote that the letters are being used as operators we will use square brackets. Thus

$$\begin{aligned}
 [AB\gamma] &= [U - \alpha][U - \beta][U - C] \\
 &= [U^3] - [U^2\alpha] - [U^2\beta] - [U^2C] + [U\alpha\beta] + [U\alpha C] + [U\beta C] - [\alpha\beta C]
 \end{aligned}$$

or

$$(AB\gamma) = (U) - (\alpha) - (\beta) - (C) + (\alpha\beta) + (\alpha C) + (\beta C) - (\alpha\beta C).$$

We only mention the process as it affords such a rapid and easy means of expansion. The results obtained by its use can always be obtained at a little greater length by an elementary process of step-by-step substitution.

§ 6. Before proceeding to the consideration of association and so forth, it seems necessary to discuss somewhat fully the general relations subsisting between the frequencies of different groups, and the number of *independent* frequencies of any order. Suppose, for example, we are dealing with three attributes (A, B, C and their contraries). Twelve second order and eight third order groups can be formed from these. It might appear then that if the frequencies of the second order groups were given, there would be a sufficient number of equations to determine the frequencies of the third order groups. As a matter of fact this is not so; the twelve second order frequencies do not form independent data, and the question arises, How many are independent? or, in general, how many independent frequencies or groups are there in the *m*th order groups produced from *n* variables? *i.e.*, how many of these



$m$ th order frequencies must be given (nothing else being given) in order that the remaining frequencies of the same order may be calculated? These questions are considered in the next section (II.). In Section III. correlation or *association* and its measurement are treated; Section IV. deals with probable errors; and in Section V. some arithmetical examples are given of the methods and results previously discussed.

## II.—GENERAL RELATIONS.

### *Number of Independent Frequencies.*

§ 7. Before proceeding to the problem above described, we will first prove the theorem—

“The frequency of any group whatever can always be expressed entirely in terms of the frequencies of the *positive* groups of its own and lower orders, and the total frequency (U).”

This theorem may most simply be proved by the method of multiplying operators as described in the introduction, replacing any negative operator like  $\alpha$  by A and multiplying out. We may, however, effect the reduction by step-by-step substitution. Thus

$$\begin{aligned}(A\beta\gamma) &= (A\beta) - (A\beta C) \\ &= (A) - (AB) - (AC) + (ABC).\end{aligned}$$

To take terms of the fourth order, for instance—

$$\begin{aligned}(ABCD) &= (ABCD) \\ (ABC\delta) &= (ABC) - (ABCD) \\ (AB\gamma\delta) &= (AB) - (ABC) - (ABD) + (ABCD) \\ (A\beta\gamma\delta) &= (A) - (AB) - (AC) - (AD) + (ABC) + (ABD) + (ACD) - (ABCD) \\ (\alpha\beta\gamma\delta) &= (U) - (A) - (B) - (C) - (D) + (AB) + (AC) + (AD) + (BC) \\ &\quad + (BD) + (CD) - (ABC) - (ABD) - (ACD) - (BCD) + (ABCD) \\ &\quad \dots \dots (1).\end{aligned}$$

Evidently from the form of the last equation *all* the positive groups are required to express the frequency of an entirely negative group.

§ 8. Now to the problem—

“To find the number of independent frequencies of  $m$ th order groups, the number of variables being  $n$ .”

The number of *positive* groups of order  $m$  is (number of combinations of  $n$  things  $m$  together)

$$\frac{n(n-1) \dots (n-m+1)}{m!}.$$

But by the theorem of § 7 the frequency of any group of the  $m$ th order can be expressed entirely in terms of the frequencies of positive groups. Therefore the number of *independent*  $m$ th order frequencies must be equal simply to the total

number of positive groups of the  $m$ th and lower orders, including (U), the group of order zero; that is, equal to

$$1 + n + \frac{n(n-1)}{1 \cdot 2} + \dots + \frac{n(n-1) \dots (n-m+1)}{m!}$$

or

“The number of independent frequencies of the  $m$ th order in  $n$  variables is equal to the sum of the first  $(m+1)$  binomial coefficients.”

This gives the following expressions for the number of independent frequencies of the second, third, fourth, and fifth orders—

$$\begin{aligned} \text{Order 2nd} & \dots \dots \frac{1}{2}(n^2 + n + 2) \\ \text{,, 3rd} & \dots \dots \frac{1}{6}(n^3 + 5n + 6) \\ \text{,, 4th} & \dots \dots \frac{1}{24}(n^4 - 2n^3 + 11n^2 + 14n + 24) \\ \text{,, 5th} & \dots \dots \frac{1}{120}(n^5 - 5n^4 + 25n^3 + 5n^2 + 94n + 120). \end{aligned}$$

The *total* number of frequencies of any order  $m$  is equal to the number of positive frequencies of that order (see above) multiplied by  $2^m$ , since each letter, A, B, &c., may be replaced by its negative, and this gives the following expressions for the second to fifth orders:—

$$\begin{aligned} \text{Order 2nd} & \dots \dots 2n(n-1) \\ \text{,, 3rd} & \dots \dots \frac{4}{3}n(n-1)(n-2) \\ \text{,, 4th} & \dots \dots \frac{2}{3}n(n-1)(n-2)(n-3) \\ \text{,, 5th} & \dots \dots \frac{4}{15}n(n-1)(n-2)(n-3)(n-4). \end{aligned}$$

It is evident from these expressions that, in the general case, the frequencies of any order can never be expressed in terms of lower order frequencies.

Table I. below gives the number of independent frequencies and the total number from  $n = 2$  to  $n = 6$  and  $m = 2$  to  $m = 6$ .

TABLE I.

Number of Groups of the										
Number of variables. $n$ .	2nd order.		3rd order.		4th order.		5th order.		6th order.	
	Independent.	Total.	Independent.	Total.	Independent.	Total.	Independent.	Total.	Independent.	Total.
2	4	4	—	—	—	—	—	—	—	—
3	7	12	8	8	—	—	—	—	—	—
4	11	24	15	32	16	16	—	—	—	—
5	16	40	26	80	31	80	32	32	—	—
6	22	60	42	160	57	240	63	192	64	64

§ 9. *Case of Equality of Contraries.*

Before proceeding to the determination of the numbers of independent frequencies in this case, we shall first prove the following three theorems:—

Theorem I. If equality of contraries subsist for frequencies of any given order, then it subsists for all lower orders.

Theorem II. If equality of contraries subsist for any even order of frequencies, say  $2m$ , then it need not in general subsist for order  $\overline{2m + 1}$ . If, however, it be assumed to subsist for order  $\overline{2m + 1}$ , then the frequencies of this order can be expressed in terms of those of the lower order  $2m$ .

Theorem III. If equality of contraries subsist for any odd order of frequencies, say  $\overline{2m - 1}$ , then it must subsist also in frequencies of the next higher order  $2m$ . But frequencies of this higher order cannot be expressed in terms of those of order  $\overline{2m - 1}$ .

The first theorem may be very simply proved.

§ 10. Suppose we are given, for example, that equality of contraries subsists for frequencies of the fifth order; then we have

$$\begin{aligned} (ABCDE) &= (a\beta\gamma\delta\epsilon) \\ (ABCD\epsilon) &= (a\beta\gamma\delta E) \end{aligned}$$

or adding

$$(ABCD) = (a\beta\gamma\delta)$$

and so on. The expansions of contrary frequencies are in fact necessarily contrary themselves.

§ 11. Next for Theorem II. To take the simplest case, let us suppose equality of contraries given for the second order frequencies. Take any third order group and expand it in terms of its contrary and second order frequencies. This may be done most elementarily step by step. Thus

$$\begin{aligned} (aBC) &= (BC) - (ABC) \\ \therefore (a\beta C) &= (aC) - (BC) + (ABC) \\ \therefore (a\beta\gamma) &= (a\beta) - (aC) + (BC) - (ABC). \end{aligned}$$

Evidently no equality of contraries amongst second order groups will give us  $(a\beta\gamma) = (ABC)$ . But if we assume this relation to hold we must have

$$\left. \begin{aligned} 2(ABC) &= (a\beta) - (aC) + (BC) \\ &= (AB) + (BC) - (aC) \end{aligned} \right\} \dots \dots \dots (2),$$

an equation which expresses the third order frequencies in terms of the second. Similarly if equality of contraries is to subsist amongst fifth order groups when it subsists amongst those of the fourth order, we must have

$$2(ABCDE) = (ABCD) + (BCDE) + (AB\delta\epsilon) - (ABC\epsilon) - (aCDE). \dots (3).$$

As the method of expansion used is evidently quite general, this proves Theorem II.



Equations (2) and (3) are evidently quite special relations. The set of arbitrary frequencies in Table II. below is drawn up to illustrate the theorem for the case of

TABLE II.

1. Group.	2. Frequency.	3. Group.	4. Frequency.	5. Group.	6. Frequency.	7. Frequency.
A . .	91	AB . .	27	ABC . . .	18	15
B . .	91	BC . .	59	$\alpha$ BC . . .	41	44
C . .	91	AC . .	41	$\Delta$ BC . . .	23	26
$\alpha$ . .	91	$\Delta$ $\beta$ . .	64	$\Delta$ B $\gamma$ . . .	9	12
$\beta$ . .	91	A $\gamma$ . .	50	$\alpha$ $\beta$ C . . .	9	6
$\gamma$ . .	91	B $\gamma$ . .	32	$\alpha$ B $\gamma$ . . .	23	20
		$\alpha$ B . .	64	$\Delta$ $\beta$ $\gamma$ . . .	41	38
		$\alpha$ C . .	50	$\alpha$ $\beta$ $\gamma$ . . .	18	21
		$\beta$ C . .	32			
		$\alpha$ $\beta$ . .	27			
		$\beta$ $\gamma$ . .	59			
		$\alpha$ $\gamma$ . .	41			

second and third order frequencies. Column 4 gives a set of second order frequencies for which equality of contraries subsists, the numbers for this having been in other respects written down at random. These give the first order frequencies of Column 2. If we now proceed to calculate the third order frequencies by equations of the above form,

$$2(ABC) = (AB) + (BC) - (\alpha C),$$

that is, using the figures of Column 4,

$$\begin{aligned} 2(ABC) &= 27 + 59 - 50 \\ &= 36 \\ (ABC) &= 18, \end{aligned}$$

we get a set of frequencies, Column 6, for which equality of contraries subsists.

If we take, however, an arbitrary value for (ABC), say 15, and calculate the remaining frequencies of the same order from it, we get a set of third order frequencies (Column 7 of Table II.) for which equality of contraries does not subsist, but which is equally consistent with the second order frequencies.

§ 12. Now apply precisely the same method to a group of the fourth order. We get finally

$$(\alpha\beta\gamma\delta) = (\alpha\beta\gamma) - (\alpha\beta\delta) + (\alpha\delta\gamma) - (\beta\delta\gamma) + (\alpha\beta\delta\gamma).$$

But if equality of contraries subsist for the third order groups, we have by the theorems of § 11, § 10—

$$\begin{aligned} 2\{(\alpha\beta\gamma) + (\alpha\delta\gamma)\} &= (\alpha\beta) + (\beta\gamma) - (\Delta\gamma) + (\alpha\delta) + (\delta\gamma) - (\Delta\delta) \\ &= (\alpha\beta) + (\beta\gamma) + (\delta\gamma) - (\Delta\delta) \end{aligned}$$

$$\begin{aligned}
 2 \{(a\beta D) + (BCD)\} &= (a\beta) + (\beta D) - (AD) + (BC) + (CD) - (\beta D) \\
 &= (a\beta) + (BC) + (CD) - (AD) \\
 &= 2 \{(a\beta\gamma) + (aCD)\} \\
 \therefore (a\beta\gamma\delta) &= (ABCD)
 \end{aligned}$$

*i.e., if contrary frequencies are equal in the case of third order groups they are equal in the case of fourth order groups.*

The method of proof is again quite general in its application, so Theorem III. is proved.

I have thought it again worth while to illustrate the theorem numerically, and have drawn up Table III. for the purpose. A set of arbitrary fourth order frequencies (set (1)), with contraries equal, was first written down, and from them the given set

TABLE III.

	(1).	(2).	(3).		
ABCD . . .	34	30	11	ABC and $a\beta\gamma$ . . .	58
ABC $\delta$ . . .	24	28	47	ABD „ $a\beta\delta$ . . .	91
AB $\gamma$ D . . .	57	61	80	ACD „ $a\gamma\delta$ . . .	102
A $\beta$ CD . . .	68	72	91	BCD „ $\beta\gamma\delta$ . . .	76
$a$ BCD . . .	42	46	65	$a$ BC „ A $\beta\gamma$ . . .	79
AB $\gamma\delta$ . . .	29	25	6	A $\beta$ C „ $aB\gamma$ . . .	107
A $\beta$ C $\delta$ . . .	39	35	16	AB $\gamma$ „ $a\beta C$ . . .	86
$a$ BC $\delta$ . . .	37	33	14	$a$ BD „ A $\beta\delta$ . . .	81
A $\beta\gamma$ D . . .	37	33	14	A $\beta$ D „ $aB\delta$ . . .	105
$a$ B $\gamma$ D . . .	39	35	16	AB $\delta$ „ $a\beta D$ . . .	53
$a\beta$ CD . . .	29	25	6	$a$ CD „ A $\gamma\delta$ . . .	71
A $\beta\gamma\delta$ . . .	42	46	65	A $\gamma$ D „ $aC\delta$ . . .	94
$a$ B $\gamma\delta$ . . .	68	72	91	AC $\delta$ „ $a\gamma D$ . . .	63
$a\beta$ C $\delta$ . . .	57	61	80	$\beta$ CD „ B $\gamma\delta$ . . .	97
$a\beta\gamma$ D . . .	24	28	47	B $\gamma$ D „ $\beta C\delta$ . . .	96
$a\beta\gamma\delta$ . . .	34	30	11	BC $\delta$ „ $\beta\gamma D$ . . .	61
	660	660	660		

of third order frequencies calculated. Now our theorem tells us that the equality amongst the fourth orders depends solely on equality amongst the thirds; so that we ought to be able to get any number of sets of fourth order frequencies, *all* possessing equality of contraries, and *all* consistent with the given set of third order. That this is so will be at once evident on trial. Take

$$(ABCD) = 30$$

for instance. Then we have at once

$$(ABC\delta) = (ABC) - (ABCD) = 58 - 30 = 28$$

$$(AB\gamma\delta) = (AB\delta) - (ABC\delta) = 53 - 28 = 25$$

$$(A\beta\gamma\delta) = (A\gamma\delta) - (AB\gamma\delta) = 71 - 25 = 46$$

$$(a\beta\gamma\delta) = (\beta\gamma\delta) - (A\beta\gamma\delta) = 76 - 46 = 30$$

giving  $(ABCD) = (a\beta\gamma\delta) = 30$ .

Similarly all the other frequencies may be calculated, and we get set (2).

If we take  $(ABCD) = 11$  we get set (3). All three sets are consistent with the set of third order, and possess equality of contraries. The state of affairs is precisely the opposite of that illustrated by Table II., where only *one* set of third order frequencies could be obtained, consistent with the given set of the second order, and possessing equality of contraries.\*

It should be noted, however, that the possible number of fourth order sets in such a case as the present is not infinite, for certain limits are imposed by the fact that negative frequencies are impossible. Thus, if we take

$$(ABCD) = 60$$

we have

$$(ABC\delta) = 58 - 60 = -2$$

or if

$$(ABCD) = 3$$

$$(ABC\delta) = 58 - 3 = 55$$

$$(AB\gamma\delta) = 53 - 55 = -2,$$

so  $(ABCD)$  must lie at all events between the limits 58 and 5.

§ 13. It follows from what we have proved that a state of *complete equality of contraries*, in which this state subsists for groups of all orders, is not and cannot be an artificial state created by choice of the points of division between A and  $\alpha$ , B and  $\beta$ , and so on, but must arise from some real and natural symmetry in the distribution of frequency. In dealing then with the next problem, to find the number of independent frequencies of any order in the case of *complete equality of contraries*, we must not rashly apply the formulæ obtained (by extrapolation, as it were) to an empirical case in which we only know that the condition subsists for a few low orders.

The general result we arrived at was that the number of independent frequencies of the  $m$ th order in  $n$  variables was given by the sum of the first  $(m + 1)$  terms of the series

$$1 + n + \frac{n(n-1)}{1 \cdot 2} + \frac{n(n-1)(n-2)}{1 \cdot 2 \cdot 3} + \dots$$

In this expression we may now strike out alternate terms commencing with  $n$ , for these represent frequencies of odd order which can be expressed in terms of the next lower order of frequencies, and so do not give any independent data. This leaves the series

$$1 + \frac{n(n-1)}{1 \cdot 2} + \frac{n(n-1)(n-2)(n-3)}{1 \cdot 2 \cdot 3 \cdot 4} + \dots,$$

\* Note 4/4/00.—I only noticed in reading Tables II. and III. in proof that the theorem holds "If two sets of ultimate  $m$ th order frequencies are both consistent with a given set of  $\overline{m-1}$ th order, the differences between corresponding pairs of  $m$ th order frequencies are numerically constant." It is noted below (pp. 272, 273) that this holds for second order frequencies. The theorem is proved at once by expanding the  $(m-1)$ th order frequencies in terms of the two sets of the  $m$ th order.

and the number of independent frequencies of order  $2m$  in  $n$  variables is equal to the sum of the first  $m + 1$  terms of this series.

The number of independent frequencies of order  $2m + 1$  is of course equal to the number of independent frequencies of order  $2m$ .

These rules give the numbers in Table IV. below.

TABLE IV. Complete Equality of Contraries.

Number of variables.	Number of independent frequencies of order,				
	2	3	4	5	6
2	2				
3	4	4			
4	7	7	8		
5	11	11	16	16	
6	16	16	31	31	32

§ 14. In the 'Phil. Trans.' for 1898 a very striking theorem was given by Mr. W. F. SHEPPARD,\* expressing the frequencies like  $(AB)$ ,  $(A\beta)$ , &c., in quadrants of the normal surface in terms of the coefficient of correlation  $r$ . Our equations like (2) in § 11, on p. 263 above, enable us at once to extend the use of this theorem to the case of three variables. Let us take two examples from the case of Heredity on the assumption of Galton's Law.

(1) If the father and grandfather of a man are both above the average as regards any one character, what is the chance that he will be above the average?

The following are the correlation coefficients:—

Son and father . . . . .	+ ·3000
Son and grandfather . . . . .	+ ·1500
Father and grandfather . . . . .	+ ·3000

Mr. SHEPPARD'S theorem then gives the following for the frequencies per 10,000 above and below average. —

	Son.			Son.			
	above	below		above	below		
Father.	above	2985	2015	Grandfather.	above	2740	2260
	below	2015	2985		below	2260	2740

The first scheme holding for father and grandfather as well as son and father.

\* 'Phil. Trans.,' A, vol. 192, p. 101.

Now if we use ABC for son, father, grandfather, and the capitals to denote "above average," Greek letters "below average," we want

$$(ABC)/(BC)$$

(BC) = 2985 at once. From § 11, p. 263,

$$\begin{aligned} 2(ABC) &= (AB) + (BC) - (aC) \\ &= 2985 + 2985 - 2260 \\ &= 3710 \\ (ABC) &= 1855, \end{aligned}$$

chance required =  $1855/2985 = \cdot 6214$ .

If *only* the father be known to be above average, chance of son being above average =  $2985/5000 = \cdot 5970$ .

If, on the other hand, we ask what is the chance that the child will be above average if both the father and mother are so, we have, assuming the correlation with both parents to be the same, using B for father, C for mother, and assuming no assortative mating :—

$$\begin{aligned} 2(ABC) &= 2985 + 2500 - 2015 = 3470 \\ (ABC) &= (1735) \end{aligned}$$

chance =  $1735/2500 = \cdot 6940$ .

But if there be *perfect* assortative mating

$$\begin{aligned} 2(ABC) &= 2985 + 5000 - 2015 \\ &= 5970 \quad (ABC) = 2985 \end{aligned}$$

chance =  $2985/5000 = \cdot 5970$ .

Thus, if there be no assortative mating, a selection of father and mother is better than a selection of parent and grandparent ; but not so if there be assortative mating to any great extent.

§ 15. The relations that we have dealt with in the preceding pages have a general bearing on the theory of certain multiple integrals. If we imagine, as we have already done on several occasions, that the distribution of frequency is really continuous and the points of division between A and  $a$ , B and  $\beta$ , &c., arbitrarily fixed, then any ultimate frequency like (ABCD) ( $A\beta C\delta$ ), for example, is equivalent to the multiple integral expressing the total frequency contained within the four axes of the frequency surface (or hyper-surface), taking each of these axes in either the positive or negative direction.

Now we know that there are  $2^n$  ultimate groups (or multiple integrals of the above kind) to be formed from  $n$  variables, all of these groups being in the general case independent. Suppose the function expressing the distribution of frequency to contain  $m$  constants that remain in the expression,  $\phi(a_1, a_2, a_3, \dots, a_m)$ , for the multiple integral. Then we have the equations



$$\begin{aligned}(\text{ABCD} \dots) &= \phi_1(a_1, a_2, a_3, \dots, a_m) \\ (\alpha\text{BCD} \dots) &= \phi_2(a_1, a_2, a_3, \dots, a_m) \\ &\text{\&c.} \qquad \qquad \text{\&c.}\end{aligned}$$

or  $2^n$  equations altogether. But if  $m < 2^n$ , we can express the constants in terms of the frequencies by means of the first  $m$  equations, and then insert their values in the remaining equations, thus obtaining  $2^n - m$  necessary relations between the frequencies. If the surface we are dealing with is symmetrical, there will be only  $2^{n-1}$  independent ultimate groups, and  $m$  must be less than  $2^{n-1}$  if special relations are to subsist between the groups.

Now this is the case in the normal surface itself. The standard deviations will not appear in any of the multiple integrals, which must be functions solely of the correlation coefficients,  $r_{12}$ ,  $r_{13}$ ,  $r_{23}$ , &c., and the total frequency. That is to say  $n$  variables give  $1 + \frac{n(n-1)}{2}$  constants that appear in the expressions for the total frequencies of the ultimate groups. This gives the following figures :—

$n$	$1 + \frac{n \cdot n - 1}{2}$	$2^{n-1}$
2	2	2
3	4	4
4	7	8
5	11	16
6	16	32

There must therefore be one relation subsisting between the ultimate fourth order groups in normal correlation—besides the mere equality of contrary frequencies—five relations between the fifth order groups, sixteen between those of the sixth order, and so on. If we could find these relations the expression of fourth order frequencies in terms of third, sixth in terms of fifth, and so on, would cease to be indeterminate as in the general case of equality of contraries. Mr. SHEPPARD'S theorem could then be extended to the case of groups of any order in normal correlation, which would give results of great interest for calculating certain chances, *e.g.*, the chance of a man being above average when his father, father and grandfather, father, grandfather, and great-grandfather were above average.

Finding myself quite unable to solve the above problem, I have handed it to Professor KARL PEARSON; he informs me that the relations sought depend on equations between the area, sides, and angles of the generalised spherical triangle in hyper-space, but the problem has not yet been solved. It is curious that investigations into the theory of logic should lead to properties of hyper-spherical triangles or tetrahedra.

## III. ASSOCIATION.

§ 16. Two qualities or attributes, A and B, are defined to be independent if the chance of finding them together is the product of the chances of finding either of them separately, *i.e.*, if

$$\frac{(AB)}{(U)} = \frac{(A)}{(U)} \cdot \frac{(B)}{(U)},$$

or

$$(AB)(U) = (A)(B).$$

This is, I think, the only legitimate test of dependence or independence—association or non-association—in the general case.

§ 17. *Theorem.*—To show that if

$$(AB)(U) = (A)(B)$$

then

$$(A\beta)(U) = (A)(\beta)$$

$$(\alpha B)(U) = (\alpha)(B)$$

$$(\alpha\beta)(U) = (\alpha)(\beta).$$

Take the first equation of these three—

$$\begin{aligned} (A)(\beta) &= (A) \{(U) - (B)\} = (U)(A) - (AB)(U) \\ &= (A\beta)(U), \end{aligned}$$

and so on for the others. So that if the chance of finding the two qualities together is the product of the chances of finding either of them separately, the chance of finding the one without the other is the chance of finding the one multiplied by the chance of not finding the other, and so on. Any one of the relations implies all the others.

§ 18. It follows at once from the above that if two attributes (A) and (B) are independent, the products of the contrary second order frequencies are equal, *i.e.*,

$$(AB)(\alpha\beta) = (A\beta)(\alpha B),$$

for each is equal to (A)(B)(\alpha)(\beta) divided by (U)<sup>2</sup>. Not only so, but the converse is also true—

§ 19. *If the cross-products are equal the variables are independent.* Thus let

$$(AB)(\alpha\beta) = (A\beta)(\alpha B).$$

Now

$$(A\beta) = (A) - (AB)$$

$$(\alpha B) = (B) - (AB)$$

$$(\alpha\beta) = (\beta) - (A\beta)$$

$$= (\beta) - (A) + (AB).$$

Therefore

$$\begin{aligned} (AB) \{(\beta) - (A) + (AB)\} &= \{(A) - (AB)\} \{(B) - (AB)\} \\ (AB) \{(\beta) - (A)\} &= (A)(B) - (AB) \{(A) + (B)\} \\ (AB) \{(B) + (\beta)\} &= (A)(B) \\ (AB)(U) &= (A)(B). \end{aligned}$$

§ 20.\* Now it seems to me that one of the chief needs in handling statistics of the kind we are considering is some sort of “coefficient of association,” which should take the place of the “*coefficient of correlation*” for continuous variables, and be a measure of the approach of association towards complete independence on the one hand and complete association on the other. Such a coefficient should—

(1) Be zero when the variables or attributes A, B, are independent, and only when they are independent.

(2) It should be +1 when, and only when, A and B are completely associated, *i.e.*, when either

$$\begin{array}{l} \text{all A's are B} \\ \text{all } \beta\text{'s are } \alpha \end{array} \left. \vphantom{\begin{array}{l} \text{all A's are B} \\ \text{all } \beta\text{'s are } \alpha \end{array}} \right\} \\ \text{or} \\ \begin{array}{l} \text{all B's are A} \\ \text{all } \alpha\text{'s are } \beta \end{array} \left. \vphantom{\begin{array}{l} \text{all B's are A} \\ \text{all } \alpha\text{'s are } \beta \end{array}} \right\}$$

or when both of these statements are true together, which can only be when

$$(A) = (B), \quad (\alpha) = (\beta).$$

The three diagrams below illustrate the three cases which correspond to

$$(A\beta) = 0, \quad (\alpha B) = 0, \quad (A\beta) = (\alpha B) = 0.$$

	(B)	( $\beta$ )
(A)	(AB)	0
( $\alpha$ )	( $\alpha B$ )	( $\alpha\beta$ )

	(B)	( $\beta$ )
(A)	(AB)	(A $\beta$ )
( $\alpha$ )	0	( $\alpha\beta$ )

	(B)	( $\beta$ )
(A)	(AB)	0
( $\alpha$ )	0	( $\alpha\beta$ )

(3) It should be -1 when, and only when, A and  $\beta$  or B and  $\alpha$  are completely associated, *i.e.*, when either

$$\begin{array}{l} \text{all A's are } \beta \\ \text{all B's are } \alpha \end{array} \left. \vphantom{\begin{array}{l} \text{all A's are } \beta \\ \text{all B's are } \alpha \end{array}} \right\} \\ \text{all } \beta\text{'s are A} \\ \text{all } \alpha\text{'s are B} \left. \vphantom{\begin{array}{l} \text{all } \beta\text{'s are A} \\ \text{all } \alpha\text{'s are B} \end{array}} \right\}$$

\* *Note added 19/1/00.*—It has several times occurred to me as quite possible that I have limited myself too much in this section by defining the case of “complete association” as equivalent simply to the logical case. An association coefficient of greater analytical convenience might have been obtained by defining attributes A and B as completely associated only when all A's were B and all B's were A. The distinction of the logical case by a definite value of the association has, however, obvious conveniences.

or when both of these statements are true, which again can only be if

$$A = (a) \quad (B) = (\beta).$$

The three diagrams below illustrate these cases of negative association which correspond to

$$(AB) = 0 \quad , \quad (a\beta) = 0 \quad , \quad (A\beta) = (aB) = 0.$$

	B	$\beta$
A	0	$A\beta$
$a$	$aB$	$a\beta$

	B	$\beta$
A	$AB$	$A\beta$
$a$	$aB$	0

	B	$\beta$
A	0	$A\beta$
$a$	$aB$	0

§ 21. The theorems just given show that

$$Q = \frac{(AB)(a\beta) - (A\beta)(aB)}{(AB)(a\beta) + (A\beta)(aB)} \dots \dots \dots (1)$$

will serve as such a coefficient of association for--

(1) When A and B are independent the numerator is zero and therefore Q zero ; and conversely when Q is zero the variables are independent.

(2) When  $(A\beta) = 0$  or  $(aB) = 0$ , or both,  $Q = +1$  ; and conversely when  $Q = +1$   $(A\beta) = 0$ ,  $(aB) = 0$ , or both.

(3) When  $(A\beta) = 0$  or  $(aB) = 0$ , or both,  $Q = -1$  ; and conversely when  $Q = -1$   $(AB) = 0$  or  $(a\beta) = 0$ , or both.

It is perfectly possible that other simple functions of the frequencies might be devised which should have the same properties, but Q at any rate will serve ; I do not wish to attach too great importance to the identical function employed. If we choose Q for such a purpose, however, its properties must be investigated.

§ 22. The numerator, or difference of the cross-products, has, as Professor KARL PEARSON has pointed out to me, a very simple and important physical meaning. It follows immediately from the equations used in § 19 for showing that when the cross-products were equal A and B were independent ; namely—

$$(AB)(a\beta) - (A\beta)(aB) = (AB)(U) - (A)(B) ;$$

or if  $(AB)_0$  be the value (AB) would have if Q were zero

$$\begin{aligned} (AB)(a\beta) - (A\beta)(aB) &= (U) \{ (AB) - (AB)_0 \} \\ &= (U) \{ (a\beta) - (a\beta)_0 \} \\ &= (U) \{ (A\beta)_0 - (A\beta) \} \\ &= (U) \{ (aB)_0 - (aB) \} \end{aligned}$$

That is to say, "The excesses of  $(AB)$  and  $(\alpha\beta)$  above  $(AB)_0$  and  $(\alpha\beta)_0$ , and of  $(A\beta)_0$  and  $(\alpha B)_0$  above  $(A\beta)$  and  $(\alpha B)$ , are all equal, and equal to the ratio of the difference of the cross-products to the number of observations." This theorem seems to me rather remarkable. I can find no similar relation for the sum of the cross-products so as to give a complete physical meaning to  $Q$ .

§ 23. Next let us determine any one of the second order frequencies, *e.g.*  $(AB)$ , in terms of  $Q$  and the first order frequencies.

If we write

$$\kappa = \frac{1 - Q}{1 + Q} \dots \dots \dots (2)$$

we have

$$\kappa(AB)(\alpha\beta) = (\alpha B)(A\beta) \dots \dots \dots (3).$$

Now

$$\begin{aligned} (\alpha B) &= (B) - (AB) \\ (A\beta) &= (A) - (AB) \\ (\alpha\beta) &= (\beta) - (A) + (AB), \end{aligned}$$

whence

$$(AB)^2(1 - \kappa) - (AB) \{ \kappa(U) + (1 - \kappa)[(A) + (B)] \} + (A)(B) = 0$$

which is a quadratic for  $(AB)$ .

Now let

$$\left. \begin{aligned} \frac{(A) - (\alpha)}{(A) + (\alpha)} &= s_1 \\ \frac{(B) - (\beta)}{(B) + (\beta)} &= s_2 \end{aligned} \right\} \dots \dots \dots (4),$$

where  $s_1$   $s_2$  may be called the surpluses of  $A$  and  $B$ . It follows that

$$\left. \begin{aligned} (A) &= \frac{1}{2}(U)(1 + s_1) \\ (\alpha) &= \frac{1}{2}(U)(1 - s_1) \end{aligned} \right\} \dots \dots \dots (5)$$

and similarly for  $(B)$  and  $(\beta)$ . In terms of these symbols the quadratic may be written

$$(AB)^2 - (AB)(U) \frac{2 + (1 - \kappa)(s_1 + s_2)}{2(1 - \kappa)} + \frac{(U)^2}{4} \frac{(1 + s_1)(1 + s_2)}{(1 - \kappa)} = 0$$

whence

$$(AB) = \frac{(U)}{4(1 - \kappa)} \left\{ 2 + (1 - \kappa)(s_1 + s_2) \pm \sqrt{(s_1 - s_2)^2 + \kappa[4 - (s_1 - s_2)^2 - (s_1 + s_2)^2] + \kappa^2(s_1 + s_2)^2} \right\} \dots \dots (6),$$



or replacing  $\kappa$  by the original  $Q$ ,

$$(AB) = \frac{(U)}{4Q} \left\{ 1 + Q(1 + s_1 + s_2) \pm \sqrt{1 - 2Qs_1s_2 - Q^2(1 - s_1^2 - s_2^2)} \right\} \quad (7).$$

§ 24. The question arises, what is the meaning of the alternative sign in the expression for  $(AB)$ ? One of the values given is, as a matter of fact, only a numerical solution, and is really impossible, so that the value of  $(AB)$  is not indeterminate. We may write (7) in the form

$$\frac{(AB)}{(A)} = \frac{1}{2Q(1 + s_1)} \left\{ 1 + Q(1 + s_1 + s_2) \pm \sqrt{1 - 2Qs_1s_2 - Q^2(1 - s_1^2 - s_2^2)} \right\} \quad (8),$$

and  $\frac{(AB)}{(A)}$  must be less than 1 and greater than 0.

The product of the two values given by the  $+$  and  $-$  sign is

$$\frac{(1 + Q)(1 + s_2)}{2Q(1 + s_1)}.$$

If  $Q$  be negative this is negative, and so the lower value is negative or impossible; we must consequently use the  $+$  sign. On the other hand, if we subtract 1 from each value above and again form the product, it is

$$\frac{(Q - 1)(1 - s_2)}{2Q(1 + s_1)},$$

and this is negative if  $Q$  be positive; hence *one* of the values is greater than unity. When  $Q$  is positive we must therefore use the  $-$  sign to the radical.

If  $Q = +1$ , one of the roots is unity and the other greater or less, according as  $s_2 \geq s_1$ . Thus, if  $Q = +1$  we have for  $(AB)$

$$(AB) = \frac{(U)}{2}(1 + s_1) \quad \text{or} \quad \frac{(U)}{2}(1 + s_2),$$

*i.e.*,  $(AB) = (A) \quad \text{or} \quad (B).$

If  $Q$  is  $-1$  on the other hand, one root is zero

$$(AB) = 0 \quad \text{or} \quad \frac{(U)}{2}(s_1 + s_2).$$

§ 25. The values of all four groups are as follows, the first sign of the radical to be used when  $Q$  is positive :—

$$(AB) = \frac{(U)}{4Q} \left\{ 1 + Q(1 + s_1 + s_2) \mp \sqrt{1 - 2Qs_1s_2 - Q^2(1 - s_1^2 - s_2^2)} \right\}$$

$$(A\beta) = \frac{(U)}{4Q} \left\{ -1 + Q(1 + s_1 - s_2) \pm \sqrt{\dots} \right\}$$

$$(\alpha B) = \frac{(U)}{4Q} \left\{ -1 + Q(1 + s_2 - s_1) \pm \sqrt{\dots} \right\}$$

$$(\alpha\beta) = \frac{(U)}{4Q} \left\{ 1 + Q(1 - s_1 - s_2) \mp \sqrt{\dots} \right\}$$

If  $s_1 = s_2 = 0$ , *i.e.*, if equality of contraries subsist amongst the first and second order groups, we have

$$\begin{aligned} (AB) &= \frac{(U)}{4Q} \{ 1 + Q \pm \sqrt{1 - Q^2} \} \dots \dots \dots (9). \\ &= \frac{(U)}{2} \cdot \frac{1}{1 + \sqrt{\kappa}} \end{aligned}$$

The following short table gives the values of  $\kappa$  and  $\sqrt{\kappa}$  for different values of  $Q$ . The values of  $\kappa$  and  $\sqrt{\kappa}$  corresponding to negative  $Q$ 's are the reciprocals of those corresponding to the positive values :—

Q.	$\kappa$ .	$\sqrt{\kappa}$ .
0	1	1
+ .1	.8182	.9045
.2	.6667	.8165
.3	.5385	.7338
.4	.4286	.6547
.5	.3333	.5773
.6	.2500	.5000
.7	.1765	.4201
.8	.1111	.3333
.9	.0526	.2294
1.0	0	0
- .1	1.2222	1.1056
.2	1.5000	1.2247
.3	1.8570	1.3628
.4	2.3333	1.5274
.5	3.0000	1.7321
.6	4.0000	2.0000
.7	5.6667	2.3804
.8	9.0000	3.0000
.9	19.0000	4.3589
1.0	$\infty$	$\infty$

*Association and Correlation.*

§ 26. The theorem already referred to, due to Mr. W. F. SHEPPARD,\* forms a connecting link between BRAVAIS' coefficient of correlation and the association coefficient in the case of normal correlation. If the divisions between A and  $\alpha$ , B and  $\beta$ , &c., are the means of the corresponding variables

\* 'Phil. Trans.,' A, 1898, vol. 162, p. 101.

$$\begin{aligned}
 r &= -\cos \frac{(AB)}{(A)} \pi = \cos \frac{(A\beta)}{(A)} \pi \\
 &= \cos \frac{\sqrt{\kappa}}{1 + \sqrt{\kappa}} \pi
 \end{aligned}
 \quad \left. \vphantom{\begin{aligned} r &= -\cos \frac{(AB)}{(A)} \pi \\ &= \cos \frac{\sqrt{\kappa}}{1 + \sqrt{\kappa}} \pi \end{aligned}} \right\} \dots \dots \dots (10)$$

where

$$\kappa = \frac{1 - Q}{1 + Q} \quad \text{as before.}$$

The figures below give corresponding values of  $Q$  and  $r$  :—

$Q$ .	$r$ .	$Q$ .	$r$ .
0	0	·6	·500
·1	·079	·7	·598
·2	·158	·8	·707
·3	·239	·9	·833
·4	·322	1·0	1·000
·5	·409		

$Q$  is always slightly in excess of  $r$ , the greatest difference being rather more than ·1 for  $Q = \cdot 7$ .

§ 27. In the general case the value of  $Q$  is necessarily a function of the position of the origin, or of the arbitrary axes which are chosen for dividing  $A$  from  $\alpha$  and  $B$  from  $\beta$ . The evaluation of  $Q$  for any pair of axes in the case of normal correlation, depends on that of certain definite integrals which have not yet been tabulated. To get some idea of the general character of the dependence I have calculated the value of  $Q$  for every possible pair of axes in the annexed (observed) frequency table; the frequencies\* being the small figures, and the values of  $Q$  those entered in heavy type at each origin. An inspection of the table will show that  $Q$  is a minimum for axes near the mean of the whole table, and a maximum for origins near the limits. At the extreme boundary the values vary suddenly and erratically, owing to the necessary discontinuity of the observed frequencies, and here we may get values  $\pm 1$  for the association. In other parts of the table, however, negative values only occur in most exceptional positions, and appear to be due to accidental irregularities. The sign of  $Q$  agrees with that of the correlation coefficient  $r$  over almost the whole table.

§ 28. It does not seem possible to obtain for  $Q$  a function that shall not vary with the position of the axes in the general case, so long, at all events, as we adhere to certain conditions of symmetry for the function  $Q$  that seem to me almost necessary. It may perhaps be possible for a strictly normal frequency distribution.

\* There is some slight error, possibly due to copying, in the frequencies of the table, as the totals of rows and columns occasionally contain odd quarters, whereas they should only contain odd halves. I do not think this is of any practical consequence.

OF ATTRIBUTES IN STATISTICS.

1	-1	-1	-1	-1	-1	-1	-1	-1	.75	.25	11	12	13	14	15	16	17	18	1	
	.5	1	.5	.25	1	.75	1	1	1	.5										5.5
2	+1	+99	.98	.95	.92	.90	.80	.64	.66	+1	+1	+1	+1							17
	.5	1	2.25	2.75	2.25	1	1.5	1.5	2.75	.25	.75	.5								
3	+1	.98	.95	.91	.88	.79	.69	.70	.86	.79	.85	+1								48
	.25	1	1.5	7.25	8.5	8.75	10.75	5	2.5	1.5	1									
4	+1	.95	.92	.91	.87	.86	.82	.82	.83	.89	.88	.95	+1							117
	.25	1	1.75	7.25	11.75	21.5	27.25	24.5	10.25	8.75	2.75									
5	+1	.91	.89	.90	.84	.83	.80	.80	.84	.87	.92	.96	+1	+1	+1					187.5
	.25	.75	.75	5.75	9.5	21.5	31	42.25	29.75	26.5	9.5	7.25	2.25	.5						
6	+1	.90	.92	.85	.85	.82	.79	.80	.81	.86	.88	.88	.93	.97	+1					226
	.25	.25	2.5	5.75	10	25	36	38.75	49.25	30.75	17	8	2.25							
7	+1	+1	+95	+85	+91	.86	.81	.79	+77	.81	.84	.87	.95	+1	+1					177.25
	.25	1.5	5.5	5.75	11.75	18.5	28.75	31.75	34	27.25	12.25	4.75	.25							
8	+1	+1	.92	.96	.96	.88	.84	.83	.82	.82	.83	.86	.93	.99	+1	+1				121
	.5	.5	4.25	8.5	10.75	22	22			22.25	17	9	3.25	1						
9	+1	+1	+1	+1	+1	.93	.91	.90	.89	.89	.87	.84	.91	.95	.97	+1				55
						1	1.5	2.25	6.75	8.25	13.5	7.5	7.75	2.5	2.25	1.75				
10																				30.7
11																				7
12																				2.5
13																				2
14																				2.5
15																				2.5
.5	2.5	4.5	7	28.5	39	69	113	140	127.5	147.5	115	99.5	52.75	83.25	12.5	5	3			

There is one case, and one only, where  $Q$  is independent of the axes chosen, and that is where the variables are strictly independent. Let  $f_m, f'_n$  be the elementary

	$f'_1$	$f'_2$	$f'_3$
$f_1$	$F_{11}$	$F_{12}$	$F_{13}$
$f_2$	$F_{21}$	$F_{22}$	$F_{23}$
$f_3$	$F_{31}$	$F_{32}$	$F_{33}$

frequencies corresponding to values  $x_m, y_n$  of the variables, and let  $F_{mn}$  be the frequency of the pair  $(x_m, y_n)$ . Then, if the variables are strictly independent, we must have in every case

$$N \cdot F_{m \cdot n} = f_m \times f'_n$$

$N$  being the total number of observations. Therefore, summing over any one quadrant, whatever the position of the axes,

$$\begin{aligned} NS(F_{m \cdot n}) &= S(f_m \times f'_n) \\ &= S(f_m) \times S(f'_n) \end{aligned}$$

or

$$N(AB) = (A)(B)$$

and so on, so that  $Q$  is zero *for all axes*. It is impossible to create an artificial association, out of real independence, by mere choice of special axes. This is a most important limitation. At the same time it must be borne in mind that where the variables are not independent, as in the table on p. 277,  $Q$  may be changed in sign or rendered vanishingly small by the choice of special (possibly exceptional) axes.\*

The whole subject of the connection between correlation and association demands further investigation, as it bristles with difficulties and possibilities of fallacy. In some practical cases there seems no doubt that the signs of  $Q$  and  $r$  would be different, and, indeed, the physical meaning attached to their interpretation. In the present paper, however, I do not deal further with the subject.

\* Cf. also the example of assortative mating according to stature from Mr. GALTON'S 'Natural Selection,' p. 82.



*Partial Associations and Associations between Groups of Attributes.*

§ 29. In the value of  $Q$ , as written in equation (1), p. 272, the "Universe of Discourse" is understood, not expressed. If "A" represent, say, deafness, and "B" blindness, we are probably dealing with the association of these infirmities within at most one nation, *e.g.*, English, or even one sex of the nation, *e.g.*, English men. Letters are not given to represent that the universe is so limited, it being generally obvious from the context, but if we take  $D = \text{English}$ ,  $E = \text{men}$ , we can write  $Q$

$$Q = \frac{(ABDE)(\alpha\beta DE) - (\alpha BDE)(A\beta DE)}{(ABDE)(\alpha\beta DE) + (\alpha BDE)(A\beta DE)} \dots \dots \dots (11),$$

adding the letters DE to every group. Such a coefficient of association will be termed a *partial* coefficient, as distinguished from the *total* coefficient of equation (1). We may speak of partial coefficients of the 1st, 2nd, . . . .  $n$ th orders, according as the universe is limited by the specification of 1, 2, 3 . . . .  $n$  attributes. These partial and total coefficients of association correspond roughly in their nature to partial and total coefficients of correlation. In the latter case, however, we limit the universe by specifying that in all members of the universe variable  $x$  shall have the fixed magnitude  $h$ ; in the former case we only specify that  $x$  shall exceed  $h$  or be less than  $h$ .

The following notation for coefficients of association seems concise and convenient. The total association between A and B we shall denote by AB between two vertical lines—thus  $|AB|$ . The partial association in the universe of C's, CD's, C $\delta$ 's, or C $\delta\epsilon$ 's we shall denote by  $|AB|C|$ ,  $|AB|CD|$ ,  $|AB|C\delta|$ ,  $|AB|C\delta\epsilon|$ .

§ 30. The number of possible partial coefficients becomes very high as soon as we go beyond four or five variables. Supposing  $m$  attributes are given, we can form

$$2^n \frac{(m-2)(m-3) \dots (m-n+1)}{|n|}$$

partial coefficients of the  $n$ th order ( $n < m-2$ ) between any one pair of attributes. For we can form  $2^n$  different universes with  $n$  attributes, and choose  $n$  attributes out of  $(m-2)$ , in

$$\frac{(m-2)(m-3) \dots (m-n+1)}{|n|}$$

different ways. But the number of possible pairs of attributes (AB, AC, BC, &c.) is  $\frac{1}{2}m(m-1)$ , and therefore the *total* number of possible partial coefficients of the  $n$ th order,

$$2^{n-1} \frac{m(m-1)(m-2) \dots (m-n-1)}{|n|}.$$

These expressions give the following figures:—

Number of attributes $m$ .	Number of partial coefficients of order $n$ : (1) between any one pair of attributes; (2) altogether.									
	$n = 1$ .		2.		3.		4.		5.	
	(1)	(2)	(1)	(2)	(1)	(2)	(1)	(2)	(1)	(2)
3	2	6								
4	4	24	4	24						
5	6	60	12	120	8	80				
6	8	120	24	360	32	480	16	240		
7	10	210	40	840	80	1680	80	1680	32	672
8	12	336	60	1680	160	4480	240	6720	192	5376

§ 31. But besides these partial coefficients there are others that we may form, where we deal with the association between two *groups* of qualities or attributes, or between a single attribute and a group. These coefficients arise naturally out of the total coefficients; for in any total coefficient a single letter may really represent an aggregate of qualities that we may more completely denote by a group of letters. Thus A may represent deaf-mutism, C imbecility, and |AC| the association between deaf-mutism and imbecility; but if we amplify the notation and use A = deafness, B = dumbness, C = imbecility, the association between deaf-mutism and imbecility will be represented by

$$|AB \cdot C| = \frac{(ABC)(a\beta\gamma) - (a\beta C)(AB\gamma)}{(ABC)(a\beta\gamma) + (a\beta C)(AB\gamma)} \dots \dots \dots (12).$$

This |AB · C| is quite distinct from |AB|C|. The latter measures the association between A and B in a group of individuals all possessing C. The former measures the association between C and the compound attribute AB.

A more general form of association coefficient is such a “group coefficient” with the universe specified, *i.e.*, a partial group coefficient. For example

$$|AB \cdot CD|E| = \frac{(ABCDE)(a\beta\gamma\delta E) - (a\beta CDE)(AB\gamma\delta E)}{(ABCDE)(a\beta\gamma\delta E) + (a\beta CDE)(AB\gamma\delta E)} \dots \dots (13).$$

#### *The Method of Serial Chances.*

§ 32. There is a very common method of handling such associations as we have here to deal with, more especially where it is desired to discuss the association of some one attribute A with a series of others B, C, D, &c. The chances (AB)/(B), (AC)/(C), &c., are simply tabulated in order of magnitude, and the attribute X for which the chance of X being A, or (AX)/(X), is greatest is held to be the “most important cause of A.”

The method seems to have been first brought forward, as a definite statistical method, by QUETELET, in a pamphlet published in 1832, ‘Sur la possibilité de mesurer

l'influence des causes qui modifient les éléments sociaux,\* but it is either explicitly or implicitly used in most statistical discussions of causation. To take an example from QUETELET's pamphlet, I give below a table of the chances of condemnation of various categories of prisoners in the French Assize Courts during the years 1825-30. Here A must stand for condemnation, B, C, D for the various attributes of the accused (superior education, being a woman, being a man, &c.). The chances tabulated are then  $(AB)/(B)$ ,  $(AC)/(C)$ , &c., except No. 8, which is  $(A)/(U)$ . QUETELET went further than a tabulation of the simple chances, and used as a measure of the "degree of influence" of the cause the function

$$\phi = \frac{(AB)/(B) - (A)/(U)}{(A)/(U)} \dots \dots \dots (14),$$

these measures being given in the second column.

État de l'accusé.	Probabilité d'être condamné.	Degré relatif d'influence de l'état de l'accusé sur la répression.
1. Ayant une instruction supérieure . . . . .	·400	- ·348
2. Condamné qui est venu purger sa contumace . . . . .	·476	- ·224
3. Accusé de crimes contre les personnes . . . . .	·477	- ·223
4. Sachant bien lire et écrire . . . . .	·543	- ·115
5. Étant femme . . . . .	·576	- ·062
6. Ayant plus de 30 ans . . . . .	·586	- ·045
7. Sachant lire et écrire imparfaitement . . . . .	·600	- ·023
8. <i>Sans désignation aucune</i> . . . . .	·614	·000
9. Étant homme . . . . .	·622	+ ·013
10. Ne sachant ni lire ni écrire . . . . .	·627	+ ·022
11. Ayant moins de 30 ans . . . . .	·630	+ ·026
12. Accusé de crimes contre les propriétés . . . . .	·655	+ ·067
13. Étant contumax . . . . .	·960	+ ·563

§ 33. Now from the work in § 22, p. 272, we have at once

$$\frac{(AB)}{(B)} - \frac{(A)}{(U)} = \frac{(AB) - (A)(B)/(U)}{(B)} = \frac{(AB) - (AB)_0}{(B)} = \frac{(AB)(a\beta) - (aB)(A\beta)}{(U)(B)}. \quad (15),$$

so that if  $(AB)/(B) > (A)/(U)$ , A and B are certainly positively associated, and if  $(AB)/(B) < (A)/(U)$  negatively associated. It does not follow, however, that if  $(AB)/(B) > (AC)/(C)$ , A and B are more closely associated than A and C. If we write

$$p_1 = (AB)/(B)$$

$$p_2 = (AC)/(C)$$

and if  $\kappa_1 \kappa_2$  are the values of the functions  $\kappa$  for AB and AC, then

\* It is entitled "Lettre à M. Willermé de l'Institut de France." Bruxelles, 1832. (Royal Statistical Society's Library.—Tracts, S. 4, vol. 5.)

$$\frac{1 + \kappa_1}{1 + \kappa_2} = \frac{p_2(1 - p_1)}{p_1(1 - p_2)} \frac{(1 - p_2)(1 + s_3) + (1 + s_1)}{(1 - p_1)(1 + s_2) + (1 + s_1)}. \quad (16),$$

$s_1, s_2, s_3$  being the surplus ratios for A, B, and C. Hence if  $s_2 = s_3$  the right-hand side is certainly less than unity, and

$$\begin{aligned} \kappa_1 &< \kappa_2 \\ Q_1 &> Q_2 \end{aligned}$$

or

That is to say, *if the surplus ratios of B and C are the same*,  $Q_1 > Q_2$  when  $p_1 > p_2$ ; but if they are not, this result does not follow. We can, then, only refer to equation (16). QUETELET'S function is for this purpose the same, in effect; as he only divides the difference of the chances by (A)/(U). We may write his function in the form

$$\phi = \frac{(AB)(\alpha\beta) - (A\beta)(\alpha B)}{(A)(B)} \dots \dots \dots (17).$$

§ 34. Now it seems to me that association coefficients and QUETELET'S functions, or chances like (AB)/(B), &c., roughly correspond in their uses to correlation coefficients and regressions. The correlation coefficient is a symmetrical function of the variables, ranging between  $\pm 1$ , and is zero when the variables are independent. The association coefficient is a symmetrical function of the attributes, ranging between  $\pm 1$ , and is zero when the attributes are unassociated. The regressions are zero when the correlation coefficient is zero, but are not symmetrical functions of the variables; they depend on the values of the standard deviations as well as the correlation; and even if the regression of  $x$  on  $y$  be greater than the regression of  $x$  on  $z$ , it does not follow that  $r_{xy} > r_{xz}$  unless  $\sigma_y = \sigma_z$ . The QUETELET functions (or simply differences of the chances (AB)/(B) - (A)/(U)) are zero when the association coefficient is zero, but are not symmetrical functions of the variables; they depend on the values of the surplus ratios as well as the association; and even if  $\phi$  for AB be greater than  $\phi$  for AC or

$$(AB)/(B) > (AC)/(C),$$

it does not follow that  $|AB| > |AC|$  unless  $s_C = s_B$ . Finally the regressions of  $x$  on  $y, z, \&c.$ , may be said to measure the "relative degrees of influence" of unit alterations in  $y, z, \&c.$ , on  $x$ , just as QUETELET takes his function to measure the "relative degrees of influence" of B, C, &c., on A. Thus, referring to the table given (p. 281), he remarks, "on voit par là qu'une instruction supérieure exerce une influence cinq fois plus grande que l'avantage d'être femme," since .348 is some five or more times .062.

I confess I do not altogether like QUETELET'S function, as there does not seem to me any point in this sort of case in dividing by (A)/(U), or  $p_0$  in our previous notation. If  $p_0$  was in one case .9 and in another .45, it seems absurd to count an attribute that raises  $p_0$  by .05 in either case, half as effective in the former case as the latter; one would rather consider it more effective in the former case.

§ 35. I do not profess to have given in the foregoing pages more than an outline of the theory of the case with which the statistician has to deal; in stronger hands it could probably be carried much further. The method I have suggested has the advantage of bringing the case of association somewhat into line with that of correlation; assimilating the method and conceptions of the case of association to those of the better known field.

The statistician has to handle problems of peculiar difficulty, where the association may have any value. The logician demands  $Q = \pm 1$  before he will consent to infer, and limits himself to this special and elementary case. At the opposite pole to that of the logician we may imagine a "logic of independence," where  $Q$  is always zero—a case hardly less artificial and quite as interesting as the converse, but one where inference is frequently impossible.

#### IV.—PROBABLE ERRORS.

§ 36. Let  $f$  be the frequency of any one group of any order, and let  $N$  be the total frequency observed. Also let  $\phi = f/N$ . Then the standard deviation of  $\phi$  or  $\sigma_\phi$  is at once given by

$$\sigma_\phi = \sqrt{\frac{\phi(1-\phi)}{N}} \dots \dots \dots (1).$$

The S.D. of the frequency  $f$  is  $N$  times this.

§ 37. Now consider the frequencies of two groups and let us find the correlation between errors in their frequencies. We must here consider two different cases, (1) where we are dealing with two ultimate groups, *e.g.*, (AB) (A $\beta$ ), or (ABC) (aBC), or (ABC) (a $\beta\gamma$ ); (2) where we are dealing with the two non-ultimate groups, *e.g.*, (A) (B), or (AB) (AC), or (AB) (CD).

CASE 1. *Ultimate Groups.*—Let  $f_1, f_2$  be the two frequencies,  $\phi_1, \phi_2$  their ratios to  $N$ . Suppose  $\phi_1$  to undergo an increment  $\Delta\phi_1$ ; there is then a total decrement  $-\Delta\phi_1$  to be spread over the remaining groups in proportion to their frequencies, the sum of the  $\phi$ 's being constant and equal to unity. Therefore

$$\Delta\phi_2 = -\Delta\phi_1 \cdot \frac{\phi_2}{1-\phi_1} \dots \dots \dots (2).$$

Let  $R_{\phi_1\phi_2}$  be the correlation coefficient between errors in  $\phi_1$  and  $\phi_2$ . Then the above equation gives us

$$R_{\phi_1\phi_2} \cdot \frac{\sigma_2}{\sigma_1} = -\frac{\phi_2}{1-\phi_1},$$

or for *ultimate groups*

$$R_{\phi_1\phi_2} = -\sqrt{\frac{\phi_1}{1-\phi_1} \cdot \frac{\phi_2}{1-\phi_2}} \dots \dots \dots (3).$$

Hence

$$R_{\phi_1\phi_2} \sigma_1 \sigma_2 = -\frac{\phi_1 \phi_2}{N} \dots \dots \dots (4),$$

an expression that we shall frequently require.



§ 38. CASE 2. *Non-ultimate Groups*.—Let A and B be the groups, to take the simplest case only, which is all we at present require. Then

$$(A) + (B) - N = (AB) - (\alpha\beta),$$

or, dividing by N, say

$$\begin{aligned} \phi_1 + \phi_2 - 1 &= \pi_1 - \pi_3 \\ \delta\phi_1 + \delta\phi_2 &= \delta\pi_1 - \delta\pi_3 \quad \dots \dots \dots (5). \end{aligned}$$

Squaring

$$\sigma_{\phi_1}^2 + \sigma_{\phi_2}^2 + 2\sigma_{\phi_1}\sigma_{\phi_2}R_{\phi_1\phi_2} = \sigma_{\pi_1}^2 + \sigma_{\pi_3}^2 - 2\sigma_{\pi_1}\sigma_{\pi_3}R_{\pi_1\pi_3} \quad \dots \dots (6).$$

$$2\sigma_{\phi_1}\sigma_{\phi_2}R_{\phi_1\phi_2} = \frac{1}{N} \{ (\pi_1 + \pi_3) - (\pi_1 - \pi_3)^2 + \phi_1 - \phi_1^2 + \phi_2 - \phi_2^2 \}.$$

Substitute for  $(\pi_1 - \pi_3)$  in terms of the first order frequencies, and also for  $\pi_3$  in the first bracket. Then we have

$$\sigma_{\phi_1}\sigma_{\phi_2}R_{\phi_1\phi_2} = \frac{1}{N}(\pi_1 - \phi_1\phi_2) \quad \dots \dots \dots (7),$$

or for  $R_{\phi_1\phi_2}$  when these are *non-ultimate* groups

$$R_{\phi_1\phi_2} = \frac{\pi_1 - \phi_1\phi_2}{\sqrt{\phi_1\phi_2(1-\phi_1)(1-\phi_2)}} \quad \dots \dots \dots (8).$$

Now if the attributes AB are independent  $\pi_1 = \phi_1\phi_2$ , so that if the attributes are unassociated errors in their frequencies are uncorrelated. On the other hand, errors in the frequencies will be perfectly correlated only if

$$(AB) = (\alpha\beta) = 0$$

or else

$$(\alpha B) = (A\beta) = 0,$$

which is more than is necessary for complete association ( $Q = \pm 1$ ). If the groups are ultimate we see from equation (3) that errors in their frequencies are always correlated, unless, indeed, the frequency of one of the groups be vanishingly small.

§ 39. We may now proceed to find the probable errors or standard errors of  $\kappa$  and Q. Let  $\phi_1, \phi_2, \phi_3, \phi_4$  be the values of  $\phi$  for any four groups forming a tetrad, *e.g.*, let

$$\begin{aligned} \phi_1 &= (ABCDE)/N & \phi_2 &= (A\beta CDE)/N \\ \phi_3 &= (\alpha\beta CDE)/N & \phi_4 &= (\alpha BCDE)/N. \end{aligned}$$

Then for this tetrad  $\kappa$  (equation (2), p. 273) is given by

$$\begin{aligned} \kappa &= \frac{\phi_2\phi_4}{\phi_1\phi_3} \\ \frac{\delta\kappa}{\kappa} &= \frac{\delta\phi_2}{\phi_2} + \frac{\delta\phi_4}{\phi_4} - \frac{\delta\phi_1}{\phi_1} - \frac{\delta\phi_3}{\phi_3} \end{aligned}$$

$$\begin{aligned}
\frac{\sigma_{\kappa^2}}{\kappa^2} &= \frac{\sigma_{\phi_1^2}}{\phi_1^2} + \frac{\sigma_{\phi_2^2}}{\phi_2^2} + \frac{\sigma_{\phi_3^2}}{\phi_3^2} + \frac{\sigma_{\phi_4^2}}{\phi_4^2} \\
&+ \frac{2}{\phi_2\phi_4} \sigma_{\phi_2}\sigma_{\phi_4} R_{\phi_2\phi_4} + \frac{2}{\phi_1\phi_3} \sigma_{\phi_1}\sigma_{\phi_3} R_{\phi_1\phi_3} \\
&- \frac{2}{\phi_1\phi_2} \sigma_{\phi_1}\sigma_{\phi_2} R_{\phi_1\phi_2} - \frac{2}{\phi_1\phi_4} \sigma_{\phi_1}\sigma_{\phi_4} R_{\phi_1\phi_4} \\
&- \frac{2}{\phi_2\phi_3} \sigma_{\phi_2}\sigma_{\phi_3} R_{\phi_2\phi_3} - \frac{2}{\phi_3\phi_4} \sigma_{\phi_3}\sigma_{\phi_4} R_{\phi_3\phi_4} \\
\frac{\sigma_{\kappa^2}}{\kappa^2} &= \frac{1}{N} \left\{ \frac{1-\phi_1}{\phi_1} + \frac{1-\phi_3}{\phi_3} + \frac{1-\phi_2}{\phi_2} + \frac{1-\phi_4}{\phi_4} + 4 \right\} \\
&= \frac{1}{N} \left\{ \frac{1}{\phi_1} + \frac{1}{\phi_2} + \frac{1}{\phi_3} + \frac{1}{\phi_4} \right\} \\
\sigma_{\kappa} &= \frac{\kappa}{\sqrt{N}} \sqrt{\frac{1}{\phi_1} + \frac{1}{\phi_2} + \frac{1}{\phi_3} + \frac{1}{\phi_4}} \dots \dots \dots (9).
\end{aligned}$$

We may write the above

$$\begin{aligned}
\frac{\sigma_{\kappa^2}}{\kappa^2} &= \frac{(\phi_2\phi_3\phi_4 + \phi_1\phi_3\phi_4 + \phi_1\phi_2\phi_4 + \phi_1\phi_2\phi_3)}{\phi_1\phi_2\phi_3\phi_4} \frac{1}{N} \\
\sigma_{\kappa^2} &= \frac{(\phi_2\phi_3\phi_4 + \phi_1\phi_3\phi_4 + \phi_1\phi_2\phi_4 + \phi_1\phi_2\phi_3)}{N} \cdot \frac{\phi_2\phi_4}{\phi_1^3\phi_3^3}.
\end{aligned}$$

Hence, if  $\phi_1$  or  $\phi_3$  is zero,  $Q = -1$ ,  $\kappa = \infty$ , and  $\sigma_{\kappa} = \infty$ ; if  $\phi_2$  or  $\phi_4$  is zero,  $Q = -1$ ,  $\kappa = 0$ , and  $\sigma_{\kappa} = 0$ .

§ 40. To take  $Q$  next, the standard error of which can be derived at once from that of  $\kappa$ ,

$$\begin{aligned}
Q &= \frac{1-\kappa}{1+\kappa} = \frac{2}{1+\kappa} - 1 \\
\delta Q &= -\frac{2}{(1+\kappa)^2} \cdot \delta\kappa \\
\sigma_Q &= \frac{4}{(1-\kappa)^4} \sigma_{\kappa^2} \dots \dots \dots (10).
\end{aligned}$$

Transform by substituting  $Q$  for  $\kappa$

$$\sigma_Q = \frac{(1-Q^2)}{2\sqrt{N}} \sqrt{\frac{1}{\phi_1} + \frac{1}{\phi_2} + \frac{1}{\phi_3} + \frac{1}{\phi_4}} \dots \dots \dots (11).$$

This again becomes apparently infinite if one of the  $\phi$ 's vanishes, but

$$\frac{(1-Q^2)^2}{\phi_1\phi_2\phi_3\phi_4} = \frac{16 \cdot \phi_1\phi_2\phi_3\phi_4}{(\phi_1\phi_3 + \phi_2\phi_4)^4} = 0$$

whichever of the  $\phi$ 's is zero. So that the probable error of the association coefficient, like that of the coefficient of correlation, vanishes at the limiting values  $\pm 1$ .

In the case of equality of contraries we may express the standard error of  $Q$  as a function of  $Q$  only (*vide* equation 9, p. 275), viz.,

$$\sigma_Q = \frac{1 - Q^2}{\sqrt{N}} \cdot \frac{1 + \sqrt{\kappa}}{2\sqrt{\kappa}} \dots \dots \dots (12).$$

The standard error of the correlation coefficient is simply  $(1 - r^2)/\sqrt{N}$ , so the S.D. of  $Q$  is the greater (for equal numerical values of  $Q$  and  $r$ ) by the fraction on the right. The value of this fraction is given below :—

Ratio of Standard Error of  $Q$  to Standard Error of  $r$   
(for equal numerical values of  $Q$  and  $r$ ).

Q.	Ratio.	Q.	Ratio.
1	1·001	·6	1·061
·2	1·005	·7	1·095
·3	1·012	·8	1·155
·4	1·023	·9	1·283
·5	1·038	1·0	1·000

For *corresponding* values of  $Q$  and  $r$ , however, the probable error of  $Q$  is less, not greater, than that of  $r$ , *i.e.*, if we form  $Q$  and  $r$  for the same material the probable error of the former constant is the smallest. The table on p. 276, § 26, gives corresponding values of the two coefficients, and these are repeated below with their probable errors :—\*

Q.	$\sqrt{N} \times$ probable error.	Value of $r$ corresponding to Q.	$\sqrt{N} \times$ probable error.
·1	·668	·079	·670
·2	·651	·158	·657
·3	·621	·239	·636
·4	·580	·322	·605
·5	·525	·409	·562
·6	·458	·500	·506
·7	·377	·598	·441
·8	·280	·707	·337
·9	·164	·833	·206

In determining the value of the probable error of  $Q$  we have, however, implicitly assumed that the dividing points between  $A$  and  $a$ , &c., were fixed and not liable to

\* In both these tables the value used for the probable error of  $r$  corresponds to the determination of  $r$  by the product-sum method. By any other method, *e.g.*, Mr. W. F. SHEPPARD'S, the probable error is greater, and this would increase the divergence between  $Q$  and  $r$ , as regards reliability, in the last table.

error. If the dividing points be taken to be the means, this is not so, and the probable error of  $Q$  would be increased.

§ 41. The standard error of the surplus ratio comes very simply

$$\begin{aligned} s_1 &= \frac{(A) - (\alpha)}{N} = \frac{2(A)}{N} - 1 = 2\phi - 1 \\ \delta s_1 &= 2 \cdot \delta\phi \\ \sigma_{s_1} &= \frac{2}{\sqrt{N}} \sqrt{\phi(1-\phi)} = \frac{1}{\sqrt{N}} \sqrt{1-s_1^2} \dots \dots \dots (13), \end{aligned}$$

so that the probable error of  $s_1$  is the smaller the larger  $s_1$ .

§ 42. It remains to determine the correlations between errors in surplus ratios and between errors in surplus ratio and errors in association. The first problem proceeds exactly as in the case of finding the correlation between errors in two non-ultimate groups (p. 284, equations (5)–(8)).

$$(A) + (B) - N = (AB) - (\alpha\beta)$$

or say

$$\begin{aligned} \phi_1 + \phi_2 - 1 &= \pi_1 - \pi_3 \\ \therefore \delta s_1 + \delta s_2 &= 2(\delta\pi_1 - \delta\pi_3) \end{aligned}$$

where  $s_1, s_2$  are the surplus ratios of A and B. Proceeding as in the previous case

$$\sigma_{s_1} \sigma_{s_2} R_{s_1 s_2} = \frac{4}{N} (\pi_1 - \phi_1 \phi_2) \dots \dots \dots (14).$$

$$R_{s_1 s_2} = R_{\phi_1 \phi_2} = \frac{\pi_1 - \phi_1 \phi_2}{\sqrt{\phi_1 \phi_2 (1 - \phi_1)(1 - \phi_2)}} \dots \dots \dots (15).$$

Whence

$$\left. \begin{aligned} R_{s_1 s_2} \frac{\sigma_{s_1}}{\sigma_{s_2}} &= \frac{\pi_1 - \phi_1 \phi_2}{\phi_2 (1 - \phi_2)} \\ R_{s_1 s_2} \frac{\sigma_{s_2}}{\sigma_{s_1}} &= \frac{\pi_1 - \phi_1 \phi_2}{\phi_1 (1 - \phi_1)} \end{aligned} \right\} \dots \dots \dots (16).$$

These regressions are positive if A and B be positively associated. Thus if A be, for example, genius in father, B genius in son, and, if in a sample of the population there be found to be a surplus of genius differing from the average by  $\delta s_1$ , then we should expect to find in the sons of the sample a surplus  $s_2 + \delta s_2$ , where

$$\delta s_2 = R_{s_1 s_2} \frac{\sigma_{s_2}}{\sigma_{s_1}} \cdot \delta s_1.$$

§ 43. To proceed to find the correlation of errors in  $Q_{12}$  and, say,  $s_1$ .

$$\begin{aligned} \delta Q_{12} &= - \frac{2\kappa}{(1+\kappa)^2} \frac{\delta\kappa}{\kappa} \\ &= - \frac{2\kappa}{(1+\kappa)^2} \left\{ \frac{\delta\phi_2}{\phi_2} + \frac{\delta\phi_4}{\phi_4} - \frac{\delta\phi_1}{\phi_1} - \frac{\delta\phi_3}{\phi_3} \right\}. \end{aligned}$$

If

$$f_1 = \frac{(A)}{N} = \frac{(AB) + (AB)}{N} = \phi_1 + \phi_2$$

$$\delta s_1 = 2 \delta f_1 = 2 (\delta \phi_1 + \delta \phi_2)$$

$$\delta Q_{12} \cdot \delta s_1 = \frac{4\kappa}{1 + \kappa^2} \cdot \left\{ \frac{(\delta \phi_2)^2}{\phi_2} - \frac{(\delta \phi_1)^2}{\phi_1} + \frac{\delta \phi_1 \cdot \delta \phi_2}{\phi_2} + \frac{\delta \phi_1 \cdot \delta \phi_4}{\phi_4} + \frac{\delta \phi_2 \cdot \delta \phi_4}{\phi_4} - \frac{\delta \phi_1 \cdot \delta \phi_3}{\phi_3} - \frac{\delta \phi_1 \cdot \delta \phi_3}{\phi_1} - \frac{\delta \phi_2 \cdot \delta \phi_3}{\phi_3} \right\}$$

$$\sigma_{Q_{12}} \cdot \sigma_{s_1} \cdot R_{Q_{12} \cdot s_1} = \frac{4\kappa}{(1 + \kappa^2)^2} \frac{1}{N} \{ (1 - \phi_2) - (1 - \phi_1) - \phi_1 - \phi_1 - \phi_2 + \phi_1 + \phi_2 + \phi_2 \}$$

$$= 0.$$

Therefore

$$R_{Q_{12} \cdot s_1} = 0 \dots \dots \dots (17),$$

that is to say, there is no correlation between errors in association and errors in surplus. Although we were to select out of the whole population a particular group with an abnormally large surplus ratio for any one attribute, we would not expect any definite divergence from the normal in the associations of that attribute observed within the group.

Of course all the expressions we have given above are for *standard errors*; the values of the probable errors will be obtained by multiplying them by the constant .674489. . . . .

## V.—ILLUSTRATIONS.

### A. *Miscellaneous.*

- (1.) Small-pox attack rate and vaccination.
- (2.) Examples from Mr. GALTON'S "Natural Inheritance" :—
  - Assortative mating according to temper.
  - Association of temper in fraternities.
  - Inheritance of artistic faculty.
  - Assortative mating according to stature.
- (3.) Examples from DARWIN'S "Cross and Self Fertilisation" :—
  - Cross fertilisation of parentage and tallness of offspring.
  - Pure self fertilisation and crossing of flowers on same plant.

### (A). *Miscellaneous.*

#### § 44.—(1.) Small-pox and vaccination.

At the very commencement of this paper death-rates, with and without the administration of an antitoxin, were suggested as affording suitable examples of "association." Death-rates by small-pox amongst the vaccinated and unvaccinated would form such

an instance, but the figures I found most suitable to my purpose are attack-rates—not death-rates. The following table gives the (percentage) small-pox attack rate, *in houses actually invaded by small-pox*, of persons under and over 10 years of age, in five towns in which small-pox epidemics have recently occurred.\*

Town.	Date.	Attack rate under 10.		Attack rate over 10.	
		Vaccinated.	Unvaccinated.	Vaccinated.	Unvaccinated.
Sheffield . . . . .	1887-88	7·9	67·6	28·3	53·6
Warrington . . . . .	1892-93	4·4	54·5	29·9	57·6
Dewsbury . . . . .	1891-92	10·2	50·8	27·7	53·4
Leicester . . . . .	1892-93	2·5	35·3	22·2	47·0
Gloucester . . . . .	1895-96	8·8	46·3	32·2	50·0

From these data we can work out the association between “lack of vaccination” and “attack,” for children and persons over 10 years of age. If we call attack A, “non-vaccination” B, the data given are  $100 (A\beta)/(\beta)$  and  $100 (AB)/(B)$ ; subtracting each percentage from 100, we get  $100 (\alpha\beta)/(\beta)$  and  $100 (\alpha B)/(B)$ . Thus for the coefficient of association in Sheffield for children we have

$$Q = \frac{67\cdot6 \times 92\cdot1 - 32\cdot4 \times 7\cdot9}{67\cdot6 \times 92\cdot1 + 32\cdot4 \times 7\cdot9} = \cdot92$$

where we have divided through numerator and denominator of the ordinary expression for Q by  $(B)(\beta)$ , leaving its value unaltered. This seems rather an interesting case, as the form in which the data are presented does not give the surplus ratio for non-vaccination, *i.e.*, the ratio of non-vaccination to vaccinated, but does give the association coefficient Q. The whole series of values are given below, and form a striking addition to the previous table. The association between non-vaccination and attack is very high indeed for young children—·8 to ·9—but drops sharply to

Association between Non-vaccination and Attack in Infected Households.

Town.	Children under 10.	Persons over 10.
Sheffield . . . . .	·92	·49
Warrington . . . . .	·93	·52
Dewsbury . . . . .	·80	·50
Leicester . . . . .	·91	·51
Gloucester . . . . .	·80	·36

\* I have taken the table from Mr. NOEL A. HUMPHREY's paper, “Vaccination and Small-Pox Statistics,” ‘Journal Royal Statistical Soc.’ vol. 60 (1897), p. 525. It is quoted by him from the ‘Final Report of the Vaccination Commission,’ p. 65.



·5 (owing presumably to the waning protection of the vaccination made in infancy) in the older age group.

The constancy of the association in towns with widely different attack rates is a point worthy of notice. Sheffield, Warrington, and Leicester exhibit practically identical associations, although the attack rates vary from 7·9 to 2·5 and 67·6 to 35·3. Not having the original figures for these cases I cannot state the probable errors.

§ 45.—(2.) From Mr. GALTON'S "Natural Inheritance."

*Assortative Mating according to Temper.*—On p. 231 of "Natural Inheritance" Mr. GALTON gives the data, based on 111 marriages:—

Good-tempered husbands with bad-tempered wives . . .	24 per cent.
Bad-tempered " " good-tempered " " . . .	31 " "
Good-tempered " " " " " " . . .	22 " "
Bad-tempered " " bad-tempered " " . . .	23 " "

Here

$$Q = \frac{22 \times 23 - 24 \times 31}{22 \times 23 + 24 \times 31} = - \cdot 19$$

for the association between temper in husband and wife, *i.e.*, on the whole bad-tempered husbands have good-tempered wives, and *vice versa*. But the probable error of the association =

$$\cdot 6745 \frac{1 - \cdot 0361}{2} \sqrt{\frac{100}{111}} \sqrt{\frac{1}{22} + \frac{1}{23} + \frac{1}{24} + \frac{1}{31}} = \cdot 124$$

so that only very slight stress can be laid on the sign of the association.

The advantage of having the whole question of the association thus compressed into one figure, with a definite probable error, is here very clearly marked. Comparing the actual figures with the distribution in the case of no association, Mr. GALTON concluded "that the figures taken from observation run as closely with those derived through calculation as could be expected from the small number of observations." \*

§ 46. *Association of Temper in Fraternities.*—On p. 235 of "Natural Inheritance" Mr. GALTON gives, in the same investigation, data for the association of temper in a fraternity (group of brothers and sisters). Thus in sixty-six fraternities of three members there were eleven cases reported in which all were good-tempered; fifteen in which one was good and two bad; twenty-one in which one was bad and two good; and eight in which all were bad. From data of this kind I formed all the possible pairs (permutations). Thus in the above case, using G for good,  $\gamma$  for bad, I find the number of pairs as below:—

\* This conclusion is in part affected by a slight error (owing to accumulation) in the "non-associated" figures given. The (constant) difference between the observed and "non-associated" frequencies is 2 per cent. to the nearest unit.

Number of fraternities of three.	Giving pairs GG.	Giving pairs Gγ.	Giving pairs γG.	Giving pairs γγ
All good . . . . . 11	66	...	...	...
2 good, 1 bad . . . . . 15	30	30	30	...
1 good, 2 bad . . . . . 21	...	42	42	42
All bad . . . . . 8	...	...	...	48
Total . . . . .	96	72	72	90

Getting out the number of pairs in the same way for fraternities of all the sizes given, I find the totals:—

Good-good . . . . . 330 pairs.  
 Good-bad and bad-good . . . 255 „ each.  
 Bad-bad . . . . . 454 „

$$\therefore Q = \frac{330 \times 454 - 255 \times 255}{330 \times 454 + 255 \times 255} = \cdot 395.$$

This value seems rather low; the fraternal correlation of  $\cdot 4$  should correspond to an association of about  $\cdot 49$ , or more as the axes of division are not taken through the medians.

§ 47. *Inheritance of Artistic Faculty* (“Natural Inheritance,” p. 218).—The data are:—

Number of artistic children with artistic parentage . . . . . 296  
 „ „ „ non-artistic parentage . . . . . 173  
 „ non-artistic children with artistic „ . . . . . 372  
 „ „ „ non-artistic parentage . . . . . 666

We have called the parentage artistic where *either* parent is so entered. Mr. GALTON’S table does not separate the sexes. The above is consequently a kind of “mid-parentage” inheritance table. The association coefficient is

$$Q = \cdot 508 \pm \cdot 029.$$

The correlation of offspring with mid-parent is  $\cdot 42$ , corresponding to an association of  $\cdot 51$ —or remarkably close to the above; but the close agreement must be more or less accidental. As we have seen (p. 276, and example), shifting the axes of division of a correlation surface towards the extremities of the surface, so as to increase or decrease the surplus ratio of each attribute, increases the association between them. This ought to have made the association somewhat higher in the present case, as there are only 469 artistic children to 1038 non-artistic, or  $s = \cdot 378$ . It is interesting

to note that apparently, from Mr. GALTON'S figures, there is a negative correlation between the artistic character of parentage and fertility; thus :—

When both parents are artistic, number of children to fraternity is	4·93
„ one parent is	5·15
„ neither	5·28

This would not, however, affect the association between artistic faculty of parentage and offspring, as increasing or decreasing the frequencies 296 and 372 in any constant ratio would not alter the ratio of the cross-products. The interest lies in the fact that artistic faculty is apparently a heritable attribute associated (negatively) with fertility, and hence (as Professor PEARSON has pointed out) would tend to disappear in the absence of opposing causes.

§ 48. *Assortative Mating according to Stature.*—I give this example as an instance of the fact that the association between attributes depends *very largely*, in some cases, on what I have called the choice of axes, *i.e.*, the strictness of definition of the attribute. The following are the data giving the number of observed cases in which a tall, medium, or short husband was mated with a tall, medium, or short wife (“Natural Inheritance,” p. 206).

		Wife.		
		Tall.	Medium.	Short.
Husband.	Tall . . . . .	18	28	14
	Medium . . . . .	20	51	28
	Short . . . . .	12	25	9

Now, if we take the dividing point between the “tall” or “fairly tall,” and “fairly short” or “short” to be (1) between tall and medium, (2) between medium and short, we get the following data :—

	(1)	(2)
Tall husband and tall wife . . . . .	18	117
„ „ „ short wife . . . . .	42	42
Short „ „ tall „ . . . . .	32	37
„ „ „ short „ . . . . .	113	9
	205	205

In the first case

$$Q = + \cdot 20 \pm \cdot 11$$

In the second

$$Q = - \cdot 19 \pm \cdot 13.$$

Thus the first case gives a positive, the second a negative association between stature of husband and stature of wife, in both cases the value of  $Q$  is greater than its probable error, and the difference between the two  $Q$ 's is more than twice the probable error of the difference.

I think the above change of sign implies that while tallness in husband is associated with tallness in wife, (extreme) shortness is not associated with (extreme) shortness. Thus 30 per cent. of the tall husbands have tall wives, but only 20 per cent. of the short husbands have short wives; 36 per cent. of the tall wives have tall husbands, but only 18 per cent. of the short wives have short husbands. While it appears at first sight an unsatisfactory characteristic of association that its sign may depend on the axes chosen, I believe that this is not really the case. On the contrary, such changes of sign may call attention to important physical realities, masked by the application (possibly) of the "rectilinear" theory of correlation, to cases where it gives a result of a somewhat crudely average character. Where only one average sort of result is similarly desired for the association I think the lines of division between  $A$  and  $a$ , and so on, should be taken through the means or medians.

§ 49.—(3.) DARWIN'S "Cross and Self Fertilisation of Plants."

The attributes, the association of which is here discussed, are "crossing of parentage" and "tallness of height" in plants. Thus, the one attribute is *really* invariable; the parentage must be *either* crossed *or* self-fertilised—since asexual propagation is excluded. The other attribute—height—is, however, really variable, and hence, in accordance with the preceding remarks, the point of division between tallness and shortness is best taken at the mean.

In many of the species the number experimented on by DARWIN is too small to give any reliable coefficient of association. I have therefore picked out only a few of the species for which most data were available and investigated them, to see whether there were any reliable differences between the associations observed for different species, and "as a rough ground for comparison I have pooled together the results for the thirty-eight different species for which there were sufficient data, and worked out the association for the total. The data are given in the table below.

The "average height" referred to is the average height of cross and self-fertilised plants taken all together; if their numbers were unequal the cross and self-fertilised were averaged separately, and the mean of the two averages taken. Different generations are also all pooled together for each species, but each of the tables in the book (different generations or experiments) was averaged separately, and the heights in it referred to its own averages.\*

\* For other details I must refer to the book itself. Thus, in some tables a pot of "crowded plants," in



The associations I find for the whole mass and for the five species chosen are

	Number of plants.	
Whole series. . . . .	1094	$Q = + \cdot 66 \pm \cdot 025$
<i>Ipomea purpurea</i> . . . . .	146	$= + \cdot 90 \pm \cdot 028$
<i>Petunia violacea</i> . . . . .	154	$= + \cdot 90 \pm \cdot 026$
<i>Reseda lutea</i> . . . . .	64	$= + \cdot 74 \pm \cdot 086$
<i>Reseda odorata</i> . . . . .	110	$= + \cdot 49 \pm \cdot 103$
<i>Lobelia fulgens</i> . . . . .	68	$= + \cdot 29 \pm \cdot 153$

Are these differences significant? Taking successive differences down the table from *Petunia violacea* onwards I find

	Difference.	Probable error of difference.
<i>Petunia violacea</i> and <i>Reseda lutea</i> . . . . .	$\cdot 16$	$\cdot 090$
<i>Reseda lutea</i> and <i>Reseda odorata</i> . . . . .	$\cdot 25$	$\cdot 134$
<i>Reseda odorata</i> and <i>Lobelia fulgens</i> . . . . .	$\cdot 20$	$\cdot 184$

and for the extreme difference

<i>Petunia violacea</i> and <i>Lobelia fulgens</i> . . . . .	$\cdot 61$	$\cdot 155$
--	------------	-------------

These figures can leave no doubt, I think, that specific differences do exist as regards closeness of association between crossing and vigour of offspring—even in species all normally cross fertilised. The difference between *Ipomea purpurea* or *Petunia violacea* and *Lobelia fulgens* is certainly significant, and not only so but each successive difference in the above short table is greater than its probable error. It must be remembered that we are dealing with a different point to that noted by DARWIN; he is dealing with the *amount* of the difference between crossed and self fertilised offspring; we are measuring the approach towards absoluteness of the law that there is a constant difference. The law is much less absolute—permits of many more individual exceptions—with some species than with others.

A curious point is the significant difference between the wild and cultivated species of *Reseda*. The difference may possibly be due to the cultivated character of *R. odorata*, but certainly need not be, as the two first species on the list in which the association between height and crossing is  $\cdot 9$  are both cultivated species foreign to England. *Reseda odorata* was also erratic in its behaviour as regards self sterility (*cf.* “Cross and Self Fertilisation,” p. 119 and pp. 336–9), some plants being highly self fertile, others quite self sterile. The offspring of highly and slightly self fertile plants were, however, equally vigorous.

In the table on p. 295 I have entered the sign of the association in the column on the left; as I have stated, the probable errors are so large that it seems misleading to give which only the tallest of each lot was measured, is included. In other cases I have pooled outdoor-grown plants with plants in pots, taking the average height separately as above, and so on.

Association between Cross Fertilisation and Tallness of Height (CHARLES DARWIN, "Cross and Self Fertilisation"):

Species.	Sign of association.	Total observed.	Cross fertilised.		Self fertilised.	
			Above average of their generation or series.	Below average of their generation or series.	Above average of their generation or series.	Below average of their generation or series.
1. <i>Ipomea purpurea</i> . . .	+	146	63	10	18	55
2. <i>Digitalis purpurea</i> . . .	+	24	12	4	2	6
3. <i>Verbascum thapsus</i> . . .	+	12	4	2	3	3
4. <i>Gesneria pendulina</i> . . .	+	16	5	3	3	5
5. <i>Salvia coccinea</i> . . .	+	12	4	2	2	4
6. <i>Origanum vulgare</i> . . .	o	8	2	2	2	2
7. <i>Brassica oleracea</i> . . .	-	18	4	5	5	4
8. <i>Iberis umbellata</i> . . .	+	14	6	1	3	4
9. <i>Papaver vagum</i> . . .	+	30	9	6	6	9
10. <i>Eschscholzia californica</i> . . .	+	8	3	1	1	3
11. <i>Reseda lutea</i> . . .	+	64	25	7	11	21
12. <i>Reseda odorata</i> . . .	+	110	39	16	25	30
13. <i>Viola tricolor</i> . . .	+	28	12	2	1	13
14. <i>Delphinium consolida</i> . . .	+	12	3	3	2	4
15. <i>Viscaria oculata</i> . . .	o	30	8	7	8	7
16. <i>Dianthus caryophyllus</i> . . .	+	16	5	3	4	4
17. <i>Hibiscus africanus</i> . . .	-	8	2	2	3	1
18. <i>Pelargonium zonale</i> . . .	+	14	4	3	3	4
19. <i>Tropaeolum minus</i> . . .	+	16	6	2	2	6
20. <i>Limnanthes douglasii</i> . . .	+	31	12	4	4	11
21. <i>Lupinus luteus</i> . . .	+	16	8	0	2	6
22. <i>Phaseolus multiflorus</i> . . .	o	10	3	2	3	2
23. <i>Lathyrus odoratus</i> . . .	+	16	5	3	2	6
24. <i>Clarkia elegans</i> . . .	+	8	3	1	1	3
25. <i>Bartonia aurea</i> . . .	-	16	3	5	4	4
26. <i>Scabiosa atropurpurea</i> . . .	+	8	2	2	1	3
27. <i>Lactuca sativa</i> . . .	-	13	3	4	3	3
28. <i>Specularia speculum</i> . . .	+	8	2	2	1	3
29. <i>Lobelia ramosa</i> . . .	+	14	5	2	1	6
30. <i>Lobelia fulgens</i> (2nd gen.)	+	68	17	17	12	22
31. <i>Nemophila insignis</i> . . .	+	22	11	1	2	8
32. <i>Borago officinalis</i> . . .	+	8	2	2	1	3
33. <i>Nolana prostrata</i> . . .	-	10	2	3	3	2
34. <i>Petunia violacea</i> . . .	+	154	61	16	13	64
35. <i>Nicotiana tabacum</i> . . .	-	34	7	10	8	9
36. <i>Beta vulgaris</i> . . .	+	16	6	2	4	4
37. <i>Zea mays</i> . . .	+	30	12	3	3	12
38. <i>Phalaris canariensis</i> . . .	+	46	15	8	7	16
Totals . . . .	+	1094	395	168	179	372

the amounts in all cases. In six cases of the thirty-eight the sign is negative, and in three cases the association is zero.

§ 50. There is another interesting point of the same investigation in which the present method will enable us to state clearly the quantitative result and its probable



error. This is the question whether fertilisation of a flower with pollen from another flower on the same plant is any better than strict self-fertilisation. DARWIN came to the conclusion that in only one of the five species tried—*Digitalis purpurea*—was there any sensible advantage in crossing different flowers. The point was a difficulty, as there should be an advantage, though a slight one, on his theory that the benefit of cross-fertilisation arises from differences in the general constitution of flowers crossed.

In only three of the five species tried are the numerical data given in the form required for the present method. They run as below :—

	Species.			Total.
	<i>Ipomea purpurea.</i>	<i>Mimulus luteus.</i>	<i>Digitalis purpurea.</i>	
Table in book . . . . .	XII.	XXI., XXII.	XXIV.	
Cross {	Above average . . . . .	21	19	57
	Below average . . . . .	14	6	36
Self {	Above average . . . . .	16	11	49
	Below average . . . . .	9	14	44
Total . . . . .	62	74	50	186
Association coefficient Q . . . . .	- .34 ± .160	+ .27 ± .147	+ .60 ± .133	.174 ± .097
Difference of Q's and probable error of difference	} .61 ± .217		.33 ± .198	

Thus, in the case of *Ipomea purpurea*, the association is distinctly negative—crossing with another flower of the plant was worse than pure self-fertilisation—but in both the other cases it is positive. *Mimulus*, it is true, offers somewhat doubtful evidence (two experiments having given conflicting results), but the coefficient of association is almost twice its probable error. The foxglove certainly exhibits far the highest and most significant association. Two out of the three species give a positive result, and if all the species are pooled together the result is positive. The fact is we are looking, in all probability, for a very small association, and extensive experiments may be necessary to render its existence certain. Taking the above results together, I should certainly say they gave evidence on the whole of a positive association. The odds against the negative association in the case of *Ipomea* occurring as a purely

chance deviation from the positive would be, roughly, twenty-one to four, or say five to one only—not overwhelming odds by any means.

As in the general case of complete crossing *versus* self-fertilisation, the differences between species are, however, almost certainly significant. It may be true that “crossing of different flowers on the same plant is always, *on the average*, better than pure self-fertilisation,” but the closeness with which the law holds good will vary in different species.

## VI.—ILLUSTRATIONS—*continued*.

### (B.) *The Association of Defects in Children and Adults.*

§ 51. The material on which the following investigation is based is drawn almost wholly from the “Report on the Scientific Study of the Mental and Physical conditions of Childhood,”\* issued by a committee with representatives from the British Medical Association, the British Association, the Charity Organization Society, &c. Before 1892 the same work was in the hands of other committees of those bodies, and in 1897, a “Childhood Society” was formed to carry it on. Two series of investigations have been made under these committees, the first from 1888–91, the second from 1892–94. As I understand, the whole of the observations in the first period, and the great majority of them in the second, have been made by Dr. FRANCIS WARNER.

For the complete description of the method of observation, &c., I must refer to the report itself. A very large number of schools were visited (Board Schools, Poor Law Schools, Voluntary Schools, &c., most, but not all, in London), and the children in them examined individually for the presence or absence of certain defects, of which the main classes were (using Dr. WARNER’S notation).†

- A. *Defects in development* of the body or its parts; in size, form, or proportioning of parts.
- B. *Abnormal nerve signs*; certain abnormal actions, movements, and balances.
- C. *Low nutrition*, as indicated by the child being thin, pale, or delicate.
- D. *Mental dulness*. The teachers’ report as to mental ability was added to the record of each child registered, and those stated to be below the average in ability for school work were registered as “Dull.”

These main classes of defects observed were the same in both investigations, in each of which 50,000 children were observed. The returns given are, however, somewhat more detailed for the later investigation, the material being sub-divided, for instance, into school standards. I have used material from both.

§ 52. The whole of this mass of observations was made, as stated, on children not

\* Published by the Committee, Parkes Museum, Margaret Street. Price 2s. 6d.

† Report; pp. 12–13. A fuller description of the signs is given on pp. 13–16 and pp. 72 *et seq.*

older than fourteen years or so. For purposes of comparison, and in order to be able to follow the association of defects from childhood to old age, I have made some use of the material available in the Census.\* This consists of the numbers of those who are blind, deaf and dumb, or mentally deranged, and the numbers of those suffering from combinations of these defects; the sexes are separated and the numbers in different age groups are given. The figures are very unreliable in the early age groups (0—5, 5—10, 10—15), especially for “mental derangement,”† but so far as I know they are the only figures of the kind published. I have not used the age group 0—5 at all, and the others appear to give much the sort of associations one would expect, quite comparable with those given by the results of Dr. WARNER’S investigations.

§ 53. The case to be treated is by no means a simple one. Suppose a certain group of young children to be observed at some time and the frequencies of all combinations of certain defects noted; let the survivors be again observed after a lapse of years, and the defects be again noted. Changes in the relative frequencies and the associations observed between defects will have taken place for three reasons—

- (1) Because some of those originally observed have died;
- (2) Because some have outgrown or lost certain defects;
- (3) Because others have acquired defects.

We have taken the case as referring to children, but the first and third causes of change are equally, or more, effective in the case of adults.

Now if the observations were made as supposed, and a record kept of *the same individuals*, the effect of each change could be distinguished. Those who had either lost or acquired defects‡ during the intervening period could be struck out of both series; the resulting changes would be due to selection only, and so on. But unfortunately this is not the case in any published statistics of which I am aware, even in the “Childhood Committee’s” work, where such a procedure might well have been adopted. All that is given is that a certain group, closely centered round a

\* Census of 1891, vol. 3, Tables 15, 16, p. lvii.; 1881, vol. 3, Tables 14, 15, p. xlv. In the Census of 1871 the numbers with combinations of defects are not given, so the material is not available for the present purpose. In the Census of 1881 those who are “Idiot or Imbecile” are distinguished from the “Insane,” both in the first and second order groups, and I have made some use of this (*cf.* below, p. 312). In 1891 those “Mentally Deranged from Childhood” and “Blind from Childhood” are distinguished from others, but the same distinction is not continued where these defects are combined with others. The notation of the Census is not clear: by the courtesy of the Registrar-General I am informed that “Blind” *includes* “Blind and Dumb,” and so on; but “Blind and Dumb” does *not* include “Blind, Dumb, and Mentally Deranged,” *i.e.*, the frequencies given are (A) (B) (C) (AB $\gamma$ ) (A $\beta$ C) ( $\alpha$ BC) (ABC). This should be made clear in a future Census.

† *Cf.* remarks in the Census Reports for 1881: General Report, p. 68.

‡ I speak of “defects” as they form our subject matter, but the reasoning applies to attributes of any kind. I would define a defect, tentatively, as an attribute the possessors of which have a death-rate above normal, but I do not *know* that this applies to all, *e.g.*, of the defects noted by Dr. WARNER.

certain age, has certain percentages of defectives and exhibits certain associations between defects. Another group, of another mean age, has different percentages of defects and different associations. Such differences are due to all three of the above causes of change acting together, superposed in general on wholly unknown initial differences between the groups, due either to their being differently gathered samples, or to a secular change taking place in the population. It becomes, then, impossible to separate, except conjecturally and in a more or less tentative manner, the effects of selection from those of *growth*—including under this term all processes of change that take place in the individual.

§ 54. Let  $(AB)_1, (A\beta)_1, (\alpha B)_1, (\alpha\beta)_1$  be the four second-order frequencies observed for any pair of defects for an early age, and let  $(AB)_2, (A\beta)_2, (\alpha B)_2, (\alpha\beta)_2$  be the frequencies at a later age in the same individuals, or in an older age group of the same population. Then if  $Q_1, Q_2$  be the association coefficients for the two groups,  $\kappa_1, \kappa_2$  the values of the corresponding ratio of the cross products

$$\text{if } \begin{aligned} Q_2 &< Q_1 \\ \kappa_2 &> \kappa_1 \end{aligned}$$

$$\text{or } \frac{(\alpha B)_2 (A\beta)_2}{(AB)_2 (\alpha\beta)_2} > \frac{(\alpha B)_1 (A\beta)_1}{(AB)_1 (\alpha\beta)_1}$$

$$\text{Let } \frac{(\alpha B)_2}{(\alpha B)_1} \cdot \frac{(A\beta)_2}{(A\beta)_1} > \frac{(AB)_2}{(AB)_1} \cdot \frac{(\alpha\beta)_2}{(\alpha\beta)_1}$$

$$\text{Then } \frac{(AB)_2}{(AB)_1} = s_1 \cdot \frac{(A\beta)_2}{(A\beta)_1} = s_2 \cdot \frac{(\alpha\beta)_2}{(\alpha\beta)_1} = s_3 \cdot \frac{(\alpha B)_2}{(\alpha B)_1} = s_4.$$

$$\text{so long as } Q_2 < Q_1$$

$$s_1 s_3 < s_2 s_4.$$

If we are dealing with a population subjected solely to selection,  $s_1, s_2, s_3, s_4$  are the survival rates for the four classes; the quantities  $s_2/s_1, s_3/s_1, s_4/s_1$  we may call the “survival figures” for the three classes, and the condition may be written

$$\sigma_3 < \sigma_2 \sigma_4.$$

That is, if the survival figure for the class with two defects be less than the product of the survival figures for the singly defective classes, the association will decrease. *A priori* I could not say whether this condition should hold or not; it appears possible that selection might either decrease or increase association. Practically the condition does seem to hold,\* but, as mentioned above, the evidence is not complete nor certain, for we cannot, amongst present data, find a single case in which change is certainly due to selection alone without other causes.

When we are comparing one age group with another of the same population the

\* Below p. 312–315.



s's are no longer, of course, simple survival rates, and may be greater than unity. This is notably the case for instance with such defects as increase rapidly in old age, *e.g.*, blindness or mental derangement.

§ 55. Let us turn now to the consideration of Dr. WARNER'S materials. In Table I. below I give the associations observed between the six possible pairs of defects in the two successive investigations, together with the probable errors of the association coefficients. At the bottom of the table are given the percentages of the children, observed with given defects A, B, C, or D, and with any defect or combination of defects.\* The associations observed are on the whole very markedly lower in the second investigation, and the percentages of children with given defects are smaller (except for dulness), but owing to the lower association the total percentage of defective children has risen, in the case of the girls, from 14·3 to 14·8 per cent.

TABLE I.—Comparison of the Association Coefficients in the Investigations of 1888-91 and 1892-94. A. Development Defects. B. Nerve Signs. C. Low Nutrition. D. Mental Dulness.

	Boys.		Girls.	
	1888-91.	1892-94.	1888-91.	1892-94.
AB  . . . . .	·898 ± ·003	·750 ± ·005	·904 ± ·003	·784 ± ·008
AC  . . . . .	·903 ± ·004	·848 ± ·007	·952 ± ·002	·916 ± ·004
AD  . . . . .	·893 ± ·003	·846 ± ·005	·929 ± ·003	·900 ± ·004
BC  . . . . .	·862 ± ·006	·783 ± ·010	·914 ± ·004	·814 ± ·009
BD  . . . . .	·893 ± ·003	·897 ± ·003	·926 ± ·003	·905 ± ·004
CD  . . . . .	·791 ± ·009	·823 ± ·008	·863 ± ·006	·835 ± ·008
Percentage of children with defect	A . . . . .	13·5	9·6	6·8
	B . . . . .	12·6	11·9	8·5
	C . . . . .	3·8	3·1	4·4
	D . . . . .	8·2	8·7	6·3
With any defect. . . . .	19·9	18·2	14·3	14·8

The associations are, however, all high (very high compared with most coefficients of organic correlation with which one has to deal), ranging from ·784 to ·952.

\* *I.e.*, the last figure is  $100(1 - (\alpha\beta\gamma\delta)/N)$ .

§ 56. The differences between the associations cannot probably be, at present at all events, assigned to any definite cause or any definite difference in the material observed. We would expect to find differences of association in different groups, just as we find differences between the correlation coefficient for different local races, without our being able to say with certainty how these differences have come about. In many cases the differences are certainly real, as they are large compared with the probable errors of the differences—three to eight times the probable errors. That considerable differences exist between different classes of schools, not only in the proportions of defective children but in the associations between defects, is shown by Table II. (based on Table 19 of the Report), and consequently the divergence between the results of the two investigations may be due to the different classes of schools observed. Such differences between schools may in their turn be partly or wholly due to differences of age or nationality between the children. The effects of age we deal with below (pp. 309, *et seq.*); the differences between nationalities\* are illustrated by Table III. (based on Tables 27, 28 of the Report), showing the associations for English, Jews, and Irish :—

§ 57. These two tables suggested to me at first sight an apparent law—that associations were on the whole higher where populations were healthier or less defective. If we take Table II., 4 of the 6 associations in Poor Law schools are greater than those in Industrial schools; 4 of the associations in Homes and Orphanages are greater than those of the Poor Law schools, equality subsisting in one of the remaining cases; and 5 of the associations in Elementary schools are greater than those in Homes and Orphanages, taking the schools in order of healthiness. The case is not so marked for girls, and we must note that for them the Homes and Orphanages are *more* defective than Poor Law schools. In Table III. for the boys, Jews are more defective than English, and Irish than Jews; the Jews are less associated than the English in 4 cases of the 6, and the Irish less associated than the Jews in 4 cases out of 6 also. But again the case breaks down for girls. English girls are more defective than Jewish girls, but their associations are less in just 3 out of the 6 cases; Irish girls are more defective than English, but their associations are actually greater in the majority of cases.

If we compare in this way only those cases that are adjacent in the order of defectiveness we get

TABLE II.—

	Boys.	Girls.
Associations greater where defectiveness less in 12 cases, in 9 cases.		
„ less or equal „ „ „	6	9

TABLE III.—

Associations greater where defectiveness less in 8	„	5	„
„ less or equal „ „ „	4	7	„

\* It must be noted that they were all *London* children



TABLE II.—Illustrating the Variation of the Association between Defects in different Groups of Schools (1888-91 investigation). At the bottom of the Table are given the Percentages of Children with given Defects or with any Defect in each Group. A. Development Defects. B. Nerve Signs. C. Low Nutrition. D. Mental Dulness.

Association coefficients.	Boys.				Girls.			
	Certified industrial schools.	Poor Law schools.	Homes and orphanages.	Public elementary schools.	Certified industrial schools.	Poor Law schools.	Homes and orphanages.	Public elementary schools.
AB	$\cdot 860 \pm \cdot 013$	$\cdot 915 \pm \cdot 005$	$\cdot 958 \pm \cdot 008$	$\cdot 885 \pm \cdot 004$	$\cdot 920 \pm \cdot 018$	$\cdot 926 \pm \cdot 006$	$\cdot 920 \pm \cdot 012$	$\cdot 895 \pm \cdot 004$
AC	$\cdot 762 \pm \cdot 046$	$\cdot 865 \pm \cdot 014$	$\cdot 916 \pm \cdot 032$	$\cdot 921 \pm \cdot 004$	$\cdot 923 \pm \cdot 022$	$\cdot 910 \pm \cdot 012$	$\cdot 946 \pm \cdot 015$	$\cdot 960 \pm \cdot 002$
AD	$\cdot 856 \pm \cdot 015$	$\cdot 893 \pm \cdot 007$	$\cdot 935 \pm \cdot 013$	$\cdot 893 \pm \cdot 004$	$\cdot 882 \pm \cdot 026$	$\cdot 925 \pm \cdot 007$	$\cdot 936 \pm \cdot 010$	$\cdot 930 \pm \cdot 003$
BC	$\cdot 894 \pm \cdot 040$	$\cdot 881 \pm \cdot 011$	$\cdot 540 \pm \cdot 124$	$\cdot 874 \pm \cdot 006$	$\cdot 919 \pm \cdot 023$	$\cdot 863 \pm \cdot 017$	$\cdot 882 \pm \cdot 026$	$\cdot 924 \pm \cdot 004$
BD	$\cdot 864 \pm \cdot 014$	$\cdot 894 \pm \cdot 007$	$\cdot 894 \pm \cdot 019$	$\cdot 895 \pm \cdot 004$	$\cdot 941 \pm \cdot 013$	$\cdot 929 \pm \cdot 007$	$\cdot 918 \pm \cdot 013$	$\cdot 925 \pm \cdot 004$
CD	$\cdot 761 \pm \cdot 045$	$\cdot 659 \pm \cdot 029$	$\cdot 821 \pm \cdot 055$	$\cdot 830 \pm \cdot 008$	$\cdot 758 \pm \cdot 058$	$\cdot 861 \pm \cdot 018$	$\cdot 882 \pm \cdot 026$	$\cdot 871 \pm \cdot 007$
Per cent. A	20·7	15·2	13·8	12·3	15·2	12·0	11·9	8·8
Per cent. B	20·9	14·8	14·5	11·2	14·0	9·8	10·7	8·5
Per cent. C	2·6	4·0	2·2	3·9	7·6	3·5	3·6	2·2
Per cent. D	14·0	8·4	8·9	7·6	11·5	7·1	10·7	5·7
With any defect	29·9	21·9	18·6	18·5	20·9	16·4	17·7	13·7

TABLE III.—Illustrating the Variation in Associations between Defects in different Nationalities (1892–94).

A. Development Defects. B. Nerve Signs. C. Low Nutrition. D. Dulness.

Association.	English.	Jews.	Irish.
AB  { Boys. . . Girls. . .	.752 ± .008 .768 ± .009	.734 ± .023 .835 ± .018	.729 ± .023 .860 ± .017
AC  { Boys. . . Girls. . .	.862 ± .008 .916 ± .005	.832 ± .025 .914 ± .015	.750 ± .037 .903 ± .016
AD  { Boys. . . Girls. . .	.849 ± .006 .894 ± .005	.863 ± .014 .910 ± .001	.785 ± .022 .929 ± .010
BC  { Boys. . . Girls. . .	.787 ± .011 .808 ± .010	.796 ± .029 .822 ± .029	.735 ± .047 .863 ± .021
BD  { Boys. . . Girls. . .	.904 ± .004 .906 ± .004	.847 ± .015 .881 ± .013	.894 ± .017 .914 ± .011
CD  { Boys. . . Girls. . .	.843 ± .009 .840 ± .009	.710 ± .042 .771 ± .038	.770 ± .035 .839 ± .026
Per cent. { Boys. . . A { Girls. . .	8.4 6.8	9.2 6.3	11.6 8.4
Per cent. { Boys. . . B { Girls. . .	10.2 8.4	11.9 7.9	14.8 9.0
Per cent. { Boys. . . C { Girls. . .	2.8 3.4	3.0 2.4	3.3 3.9
Per cent. { Boys. . . D { Girls. . .	8.0 7.0	8.1 6.6	8.4 6.5
Number { Boys. . . observed { Girls. . .	20,682 18,286	2,631 2,668	2,171 1,952

Thus the statistics of the girls do not at all support the first impression given by the figures for boys, and the whole of Table I. is directly adverse to any such hypothesis. In 10 cases out of the 12 of that table the associations are smaller in the second investigation, but in 6 cases out of 8 the proportions of defects are also smaller. Finally, it must be remembered that the theorem given on p. 288 in the section on Probable Errors does not lead us to expect *à priori* any correlation between degree of association and degree of defectiveness, and we must therefore demand pretty clear proof of the existence of such an empirical relation. The facts shown below that women are at once less defective and more highly associated than men, and that partial coefficients of association in undefective universes are higher than total coefficients, and much higher than partial coefficients in defective universes (Tables IV. and V, pp. 306–307), may be said to bring some support to such a hypo-

thesis, but other explanations are here possible. The fact that the association decreases throughout life, as far as we can judge from present material, while defectiveness also decreases in later childhood (*cf.* below, p. 310) is against it. Thus I do not think we can accept the hypothesis without wider evidence; I have mentioned it as it occurred to me, and would probably occur to others, as covering certain of the facts presented.

§ 58. The foregoing figures of Tables I.–III. show that all the defects dealt with by Dr. WARNER are associated to a high degree, though this degree varies somewhat in different groups of material. The question now arises, can we investigate further the nature of the association between A and B or B and C? Suppose the hypothesis to be put forward, for example, that low nutrition was the cause of both defects in development and nerve signs, and that we only found the latter occurring together because they were both generally present in cases of low nutrition; could this hypothesis be tested? It could be proved at once by forming the partial coefficient  $|AB|\gamma|$ . If this were small the hypothesis would be confirmed, as we would be shown that on excluding all cases of C, A and B ceased to be associated. If, on the other hand,  $|AB|\gamma|$  were still large, even though slightly smaller than  $|AB|$ , the hypothesis could only be partially true or be a partial explanation.

The partial coefficients in undefective or negative universes thus play the same sort of part in checking interpretations as partial coefficients of correlation. Partial associations in positive or mixed universes give further information; if, for instance,  $|AB|C|$ ,  $|AB|D|$ ,  $|AB|CD|$ , &c., be all of the same order of magnitude as  $|AB|$ , it is evident that the presence of B continues to be a bad symptom—to render A more likely—even when C, D, &c., are already present. If, on the other hand, these associations are small, or zero within the limits of probable error, the piling up of symptom on symptom, or defect on defect, ceases to make the case any worse.

§ 59. Now in the present case we have four defects to handle. These give 6 total coefficients; 12 first-order coefficients with negative and 12 with positive universes; 6 second-order coefficients with wholly negative, 12 with partially positive, and 6 with wholly positive universes—or 54 altogether (excluding what I have called “group coefficients”). I did not think it worth while to calculate all these, and have confined myself to the total and second-order partial coefficients. These are given in Table IV. for boys and Table V. for girls. As well as working out the associations for children of all ages, I have divided each sex into three groups: Infants, Standards I. to III., and Standards IV. to Extra VII. (material in Report, Table 21). This serves for two purposes: first, to check signs, &c., as given in the “all ages” column; secondly, to give some idea of change of association with age, a purpose for which no other material is available in the Report.\*

\* A table is given (Table 22 of the Report) showing the frequency of *defective* groups, but the number of undefective children ( $\alpha\beta\gamma\delta$ ) is not given, nor the number of children observed at each age. This makes the figures useless for discussing the associations of defects in normal children. The importance of the

§ 60. Comparing first the partial coefficients with negative universes,  $|AB|\gamma\delta|$ , &c., with the total coefficients, we see that in every case, without exception, the partial coefficient is greater than the total. Hence it cannot be true that any one of the defects noted is, or is even indicative of, a *necessary* connecting link between any other two. That low nutrition brings on at once development defects and nerve signs, or development defects and dulness, so that we find these pairs associated is, for instance, a hypothesis that may be partly true but is insufficient to explain the facts observed. Dr. WARNER's hypothesis that "the connecting link between defects of body and defective mental action is the coincident defect of brain which may be known by observation of 'abnormal nerve-signs'"\* seems to me equally untenable; it may be so in some cases, but on the other hand the "connecting link" may be a defect of brain *not* indicated by abnormal nerve signs, or not a defect of brain at all. The demonstration of a necessary connecting link X between A and B would, it seems to me, only be complete when  $|AB|\xi|$  was shown to be small compared with  $|AB|$ ; the demonstration that *either*  $X_1$  or  $X_2$  or  $X_3$  or  $X_n$  had to be present as a connecting link would only be complete if  $|AB|\xi_1 \xi_2 \xi_3 \dots \xi_n|$  were shown to be small (zero within the limits of error). Now  $|AB|\gamma\delta|$ ,  $|AC|\beta\delta|$ , &c., are not small but even larger than  $|AB|$ ,  $|AC|$ , &c., hence CD, BD, &c., cannot be *necessary* even as alternative connecting links or symptoms of such links in the way described above; the case must be much more complex and depend on a much greater variety of conditions than those described by the four classes of defects noted. The following figures show further how little the absence of nerve signs affects the chance of an individual with development defects being mentally dull; on Dr. WARNER's hypothesis  $(A\beta D)/(A\beta)$  should be small compared with  $(AD)/(A)$  :—

	Boys.	Girls.
Chance of individual being dull who exhibits development defects = $(AD)/(A)$ . . . . .	·385	·449
Ditto, but no nerve signs = $(A\beta D)/(A\beta)$ . . . . .	·341	·411
Ditto, but neither nerve signs nor low nutrition = $(A\beta\gamma D)/(A\beta\gamma)$ . .	·329	·414

§ 61. Turning next to the partial coefficients with wholly or partly defective universes (*i.e.*, associations in groups of which every member possesses either one or two defects in addition to the possible two of which the associations are considered), we see that the great majority are small and many even negative. The probable errors are, however, high, since the material is small when we are confined to those who are defective, so one cannot always lay great stress on the sign. In three cases

omission is apparently unrecognised, as the last Report issued (1899) only gives more such figures; this seems to me waste of time and money.

\* Report, p. 13.



TABLE IV.—Showing the Associations between Defects for Boys, for different Groups of Standards, and for all Ages together. (1892–94 investigation.)

A. Development Defects. B. Nerve Signs. C. Low Nutrition. D. Mental Dulness.

Coefficient of association.	Infants.	Standards I.–III.	Standards IV.– Ex. VII.	All ages.*
AB	+·794 ± ·014	+·743 ± ·010	+·722 ± ·016	+·750 ± ·005
AC	+·900 ± ·009	+·816 ± ·013	+·802 ± ·025	+·848 ± ·007
AD	+·880 ± ·008	+·834 ± ·007	+·822 ± ·013	+·846 ± ·005
BC	+·862 ± ·012	+·749 ± ·016	+·845 ± ·019	+·783 ± ·010
BD	+·928 ± ·005	+·890 ± ·005	+·886 ± ·008	+·897 ± ·003
CD	+·868 ± ·011	+·792 ± ·014	+·748 ± ·034	+·823 ± ·008
AB $\left\{ \begin{array}{l} \gamma\delta \\ \beta\delta \end{array} \right\}$	+·859 ± ·016	+·827 ± ·010	+·790 ± ·016	+·826 ± ·007
AC $\left\{ \begin{array}{l} \beta\delta \\ \beta\gamma \end{array} \right\}$	+·962 ± ·006	+·928 ± ·009	+·928 ± ·016	+·942 ± ·005
AD $\left\{ \begin{array}{l} \beta\gamma \\ \alpha\delta \end{array} \right\}$	+·947 ± ·006	+·937 ± ·005	+·933 ± ·008	+·939 ± ·003
BC $\left\{ \begin{array}{l} \alpha\delta \\ \alpha\gamma \end{array} \right\}$	+·948 ± ·010	+·896 ± ·013	+·935 ± ·015	+·912 ± ·008
BD $\left\{ \begin{array}{l} \alpha\gamma \\ \alpha\beta \end{array} \right\}$	+·973 ± ·003	+·951 ± ·003	+·946 ± ·005	+·955 ± ·002
CD $\left\{ \begin{array}{l} \alpha\beta \\ \gamma D \end{array} \right\}$	+·964 ± ·007	+·935 ± ·011	+·923 ± ·026	+·949 ± ·006
AB $\left\{ \begin{array}{l} \gamma D \\ C\delta \end{array} \right\}$	–·429 ± ·060	–·421 ± ·038	–·532 ± ·068	–·443 ± ·027
AB $\left\{ \begin{array}{l} C\delta \\ \beta D \end{array} \right\}$	–·227 ± ·112	–·335 ± ·089	–·486 ± ·126	–·348 ± ·059
AC $\left\{ \begin{array}{l} \beta D \\ B\delta \end{array} \right\}$	+·013 ± ·101	+·125 ± ·088	+·025 ± ·211	+·096 ± ·060
AC $\left\{ \begin{array}{l} B\delta \\ \beta C \end{array} \right\}$	+·418 ± ·090	+·116 ± ·079	+·043 ± ·124	+·210 ± ·053
AD $\left\{ \begin{array}{l} \beta C \\ B\gamma \end{array} \right\}$	–·149 ± ·111	+·193 ± ·101	+·062 ± ·233	+·076 ± ·070
AD $\left\{ \begin{array}{l} B\gamma \\ \alpha D \end{array} \right\}$	+·055 ± ·079	+·088 ± ·039	+·018 ± ·065	+·079 ± ·030
BC $\left\{ \begin{array}{l} \alpha D \\ A\delta \end{array} \right\}$	–·066 ± ·102	–·227 ± ·083	–·034 ± ·187	–·201 ± ·057
BC $\left\{ \begin{array}{l} A\delta \\ \alpha C \end{array} \right\}$	+·286 ± ·087	–·077 ± ·082	+·098 ± ·133	–·002 ± ·054
BD $\left\{ \begin{array}{l} \alpha C \\ A\gamma \end{array} \right\}$	+·251 ± ·118	+·159 ± ·102	+·062 ± ·210	+·140 ± ·070
BD $\left\{ \begin{array}{l} A\gamma \\ \alpha B \end{array} \right\}$	+·370 ± ·066	+·211 ± ·043	+·132 ± ·069	+·226 ± ·031
CD $\left\{ \begin{array}{l} \alpha B \\ A\beta \end{array} \right\}$	+·116 ± ·100	+·014 ± ·071	–·126 ± ·126	+·077 ± ·050
CD $\left\{ \begin{array}{l} A\beta \\ \gamma D \end{array} \right\}$	+·043 ± ·085	+·174 ± ·073	–·012 ± ·165	+·160 ± ·049
AB CD	–·223 ± ·120	–·211 ± ·105	–·263 ± ·245	–·233 ± ·072
AC BD	+·239 ± ·100	+·345 ± ·069	+·335 ± ·155	+·323 ± ·051
AD BC	–·137 ± ·128	+·318 ± ·094	+·312 ± ·184	+·197 ± ·044
BC AD	+·164 ± ·103	+·003 ± ·080	+·281 ± ·181	+·035 ± ·058
BD AC	+·255 ± ·111	+·286 ± ·097	+·312 ± ·206	+·254 ± ·067
CD AB	–·088 ± ·113	+·251 ± ·081	+·176 ± ·167	+·197 ± ·058
Per cent. with A . . .	7·9	9·9	7·4	8·8
"    "    B . . .	6·3	13·5	8·3	10·9
"    "    C . . .	3·7	3·1	1·5	2·8
"    "    D . . .	6·7	9·7	5·4	7·9
"    "    any defect	14·0	21·2	16·3	18·2
Number observed . . .	7,055	11,482	7,168	26,287

\* "All ages" includes those in Standard 0 and in no Standard not included in the other columns.

TABLE V.—Showing the Associations between Defects for Girls, for different Groups of Standards, and for all Ages together. (1892–94 investigation.)

A. Development Defects. B. Nerve Signs. C. Low Nutrition. D. Mental Dulness.

Coefficient of association.	Infants.	Standards I.–III.	Standards IV.– Ex. VII.	All ages.*
AB   . . . . .	+·850 ± 013	+·795 ± 010	+·747 ± 021	+·784 ± 008
AC   . . . . .	+·949 ± 005	+·903 ± 007	+·881 ± 015	+·916 ± 004
AD   . . . . .	+·927 ± 006	+·886 ± 006	+·898 ± 010	+·900 ± 004
BC   . . . . .	+·866 ± 013	+·821 ± 013	+·821 ± 021	+·814 ± 009
BD   . . . . .	+·935 ± 006	+·908 ± 005	+·880 ± 010	+·905 ± 004
CD   . . . . .	+·876 ± 012	+·833 ± 011	+·746 ± 034	+·835 ± 008
AB   $\gamma\delta$ . . . . .	+·896 ± 016	+·881 ± 009	+·783 ± 026	+·850 ± 009
AC   $\beta\delta$ . . . . .	+·970 ± 004	+·974 ± 004	+·955 ± 009	+·971 ± 002
AD   $\beta\gamma$ . . . . .	+·960 ± 005	+·957 ± 004	+·963 ± 005	+·959 ± 003
BC   $\alpha\delta$ . . . . .	+·957 ± 009	+·940 ± 008	+·897 ± 017	+·927 ± 007
BD   $\alpha\gamma$ . . . . .	+·980 ± 003	+·956 ± 003	+·932 ± 008	+·955 ± 002
CD   $\alpha\beta$ . . . . .	+·940 ± 014	+·941 ± 010	+·936 ± 016	+·941 ± 007
AB   $\gamma D$ . . . . .	–·381 ± 077	–·363 ± 045	–·437 ± 076	–·394 ± 033
AB   $C\delta$ . . . . .	–·200 ± 123	–·432 ± 079	–·175 ± 140	–·352 ± 057
AC   $\beta D$ . . . . .	+·445 ± 099	+·394 ± 076	–·172 ± 180	+·325 ± 056
AC   $B\delta$ . . . . .	+·422 ± 108	+·315 ± 071	+·571 ± 081	+·445 ± 045
AD   $\beta C$ . . . . .	+·308 ± 117	+·155 ± 102	–·070 ± 199	+·170 ± 068
AD   $B\gamma$ . . . . .	+·090 ± 101	+·147 ± 048	+·433 ± 072	+·257 ± 035
BC   $\alpha D$ . . . . .	–·061 ± 154	+·006 ± 090	–·347 ± 149	–·108 ± 065
BC   $A\delta$ . . . . .	+·246 ± 097	–·106 ± 079	+·223 ± 126	+·011 ± 055
BD   $\alpha C$ . . . . .	+·320 ± 139	+·156 ± 105	–·144 ± 178	+·143 ± 077
BD   $A\gamma$ . . . . .	+·418 ± 076	+·127 ± 055	+·152 ± 097	+·211 ± 039
CD   $\alpha B$ . . . . .	–·222 ± 135	+·015 ± 071	–·117 ± 120	+·012 ± 055
CD   $A\beta$ . . . . .	+·115 ± 077	–·007 ± 072	–·339 ± 149	–·019 ± 049
AB   CD . . . . .	–·275 ± 185	–·376 ± 092	–·091 ± 268	–·296 ± 072
AC   BD . . . . .	+·535 ± 101	+·381 ± 067	+·200 ± 209	+·421 ± 051
AD   BC . . . . .	+·234 ± 155	+·219 ± 105	+·016 ± 232	+·230 ± 071
BC   AD . . . . .	+·058 ± 107	–·010 ± 079	+·015 ± 230	+·066 ± 058
BD   AC . . . . .	+·247 ± 110	+·220 ± 092	+·016 ± 232	+·230 ± 071
CD   AB . . . . .	–·078 ± 126	+·089 ± 085	–·511 ± 152	–·027 ± 063
Per cent. with A . . . . .	7·8	7·3	4·2	6·8
” ” B . . . . .	4·2	10·3	8·8	8·5
” ” C . . . . .	3·9	3·4	2·0	3·2
” ” D . . . . .	5·3	8·3	4·5	6·9
” ” any defect . . . . .	11·8	16·6	13·2	14·8
Number observed . . . . .	6,274	11,090	6,026	23,713

\* “All ages” includes those in Standard 0 and in no Standard not included in the other columns.



at least, however, if not in four, the negative sign appears to be certainly significant; I refer to the partial associations of A and B  $|AB|\gamma D|$ ,  $|AB|C\delta|$ , and  $|AB|CD|$ , in which cases all the twenty-four coefficients for both sexes are negative; and the one partial coefficient  $|BC|aD|$ , seven out of the eight examples of which are negative, the one positive value (Girls, Standards I.–III.) being only 1/15th of its probable error. The first case is the most general and remarkable, but in both it will be noted we are dealing with an association of nerve signs. As might be conjectured from the generality of the sign,  $|AB|C|$  and  $|AB|D|$  are also negative, *i.e.*, when individuals exhibit either low nutrition or mental dulness, or both, the presence of nerve signs lessens the probability of development defects being present and *vice versa*.

This case is most remarkable, and the following figures, showing the chance of an individual exhibiting development defects (or nerve signs) when he exhibits nerve signs (or development defects), and so on, illustrate it further. Multiplied by 100 the chances can, of course, be read as percentages, *i.e.*, 50 per cent. of C's are A, but only 42 per cent. of BC's are A (for the boys), and so on.

A. Development Defects.    B. Nerve Signs.    C. Low Nutrition.    D. Dulness.

Chance of individual—			Chance of individual—		
Who is	being A.		Who is	being B.	
	Boys.	Girls.		Boys.	Girls.
B	·311	·291	A	·384	·363
C	·499	·556	C	·471	·435
D	·428	·445	D	·576	·526
BC	·423	·466	AC	·398	·364
BD	·337	·352	AD	·454	·417
CD	·529	·606	CD	·523	·478
BCD	·473	·530	ACD	·468	·418

In every case the presence of B is antagonistic to that of A when either C or D is present; and A is similarly antagonistic to B. I am quite unable to suggest any possible explanation of this, but so unexpected a result ought to throw some light on the physiological relations between the signs observed. It is particularly curious to note that A and B are negatively associated in the presence of either of two defects so apparently different as mental dulness and low nutrition. The point seems to be worth further investigation by the committee.\*

\* *Note 4/4/00.*—Dr. E. B. SHULDHAM writes to me as follows: "My experience with boys at the Bisley farm schools was that many of the boys who had left poor homes in London with insufficient feeding suffered from suppuration of the cervical glands a few weeks after their removal to Bisley, also to a great change for the better in food, clothing, and shelter. After a prolonged residence at Bisley the glandular enlargements lessened, and the suppuration ceased." This is interesting for comparison with the above, as we have here

*Change of Association with Age.*

§ 62. I gather from Table XXV. of the Report that the average age of the "Infants" would be three or four years, Standards I.–III. about seven years, and Standards IV.–Ex. VII. eleven or twelve. It is unsatisfactory not having a clear classification of the children by age pure and simple, as a classification of Standards must imply an uncertain amount of selection by mental capacity.

It is a curious point that Standards I.–III. exhibit a higher percentage of defects, with the exception of cases of low nutrition, than either the "Infants" or Standards IV.–Ex. VII. The percentages are given in full for each separate Standard in Table VI. below, and in every defect there is a rise in frequency on passing from the

TABLE VI.—Showing the percentages of Children with given Defects and with any Defect in the different Standards. (1892–94 investigation.)

A. Development Defects. B. Nerve Signs. C. Low Nutrition. D. Mental Dulness.

	Nominal age.	Boys.					Girls.				
		A	B	C	D	With any defect.	A	B	C	D	With any defect.
Infants . . . . .	0–5	7·9	6·3	3·7	6·7	14·0	7·8	4·2	3·9	5·3	11·8
Standard I. . . . .	6	11·5	13·9	4·1	11·0	22·9	8·4	10·6	4·7	9·5	17·2
"  II. . . . .	7	9·7	14·1	2·9	9·2	21·2	7·2	10·3	3·2	8·1	17·1
"  III. . . . .	8	8·2	12·4	2·0	8·6	19·3	6·0	10·0	2·2	7·1	15·3
"  IV. . . . .	9	7·5	11·8	1·6	7·0	17·9	4·5	9·3	2·1	5·6	13·7
"  V. . . . .	10	7·7	9·7	1·2	4·9	16·2	4·7	7·7	1·8	2·1	12·7
"  VI. . . . .	11	7·4	9·0	1·7	4·3	15·6	3·0	9·9	2·2	3·5	13·6
"  VII. . . . .	12	6·5	7·0	1·2	2·8	12·4	2·5	8·6	2·3	1·6	11·9
Ex. VII. . . . .	13	5·5	6·9	2·1	2·8	11·8	3·8	6·9	1·5	3·8	10·7
All ages . . . . .		8·8	10·9	2·8	7·9	18·17	6·8	8·5	3·2	6·9	14·78

"All ages" includes those in Standard 0 and in no Standard.

group of "Infants" to Standard I.—in most cases a considerable rise, the percentages of nerve signs more than doubling, and the percentages of development defects for

an apparently negative association between "suppuration" and "low nutrition" in the case of boys of poor physique. Dr. SHULDHAM also states that the late Mr. H. JONES, for many years Superintendent of the boys at Bisley, noticed the fact that those boys who did not take green vegetables with their food suffered from night-blindness, which ceased when he insisted on their taking green food regularly for some weeks. This suggests that further inquiry as to nutrition and eyesight might be of a good deal of interest.

boys increasing by half; the percentage of dull also increases largely. One can only conclude that these defects, whether inherited or not, are not "innate" in the simple sense of being observable at birth or during early infancy; possibly they may be brought on in part by the school attendance itself, a theory which would account for the sudden rise after "Infancy," or rather early childhood. As for the subsequent decreases in the percentages of all defects, I am inclined to attribute them, in part at all events, to the selection by capacity that must take place. This would reduce the percentage of "mentally dull," and, owing to the association between defects, would also reduce indirectly the percentages of those with other defects. A proportion of the decrease one would expect to take place from natural selection, but probably a small proportion. We have, in fact, selective mortality, selection by mental capacity, and growth (change in the individual), all acting together as causes of change—and very probably also initial differences between the groups from which the older and younger children sprang—precisely as was indicated in the previous discussion on pp. 299–300.

§ 63. In the association coefficients there is, however, no irregularity in the group Standards I.–III.; the most cursory inspection of Tables IV. and V. shows that the total coefficients and partial coefficients with negative universes decrease when we pass from "Infants" to the next group, and again from Standards I.–III. to the next group. The changes in partial associations with positive or defective universes are not so obvious, partly, no doubt, because these coefficients are small and have large probable errors, but the majority of the changes are in the same direction. Table VII. shows the total number of changes in either direction. Thus comparing Standards I.–III. with "Infants," we see that in the case of the boys all the total associations and all the partials with negative universes have decreased; of the partial associations in defective universes 8 only decreased while 10 have increased. Taking all cases together there are 88 decreases to 32 increases, but if we cut out the partials 22 decreases to 2 increases only. However we take it there is overwhelming evidence that association in general decreases as age advances.

§ 64. That this is a law of pretty general application seems to be borne out by the entirely different class of statistics drawn from the English Census.\* In Table VIII. are given the associations derived from these figures between blindness and dumbness, blindness and mental derangement, and dumbness and mental derangement. The figures do not run quite regularly, but the associations for the age group 5–15 are, in every case, greater than the "all-ages" associations, and if we draw curves showing the change of association during life the downward trend is quite obvious (curves of figs. 1, 2, 3, p. 314).

Such decrease is again not, of course, the result of selection alone but of selective mortality, growth (change in the individual), and initial differences in the child-populations from which the successive age groups were formed. That changes in the

\* *Loc. cit.*, on p. 42.

individual will decrease association is obvious in the case of such a defect as blindness, which may be brought on by accident, cataract, or other causes having no bearing on mental derangement or dumbness. It is not obvious, however, why the association between blindness and mental derangement should be much smaller than the association between blindness and dumbness in the later age groups.

§ 65. The question of what would be the effect of selection alone—or whether it would have any regular effect in one direction—is, however, a most interesting one.

TABLE VII.—Showing the Number of Cases in which the Association Coefficient decreased or increased on passing from one group of Standards to the next. There is a great majority of decreases.

Class of coefficient.	Boys.				Girls.				Total.	
	Infants to Standards I.–III. Association.		Standards I.–III. to IV.–VII. Association.		Infants to Standards I.–III. Association.		Standards I.–III. to IV.–VII. Association.		Association.	
	Decrease.	Increase.	Decrease.	Increase.	Decrease.	Increase.	Decrease.	Increase.	Decrease.	Increase.
Total coefficients	6	—	5	1	6	—	5	1	22	2
Universe with no other defect	6	—	5	1	4	2	5	1	20	4
Universe defective . . . . .	8	10	14	4	13	5	11	7	46	26
Total . . . . .	20	10	24	6	23	7	21	9	88	32

(Note.—Two coefficients that remained constant from one Standard group to the next have been entered as decreasing.)

The fact that partial associations in undefective universes are higher than total associations, combined with my first impression (unjustified I think) that associations were, on the whole, higher in the healthier groups, led me at first to believe that the effect of selection would be to increase associations. I still cannot help thinking that this is practically, as it is formally, possible, it being remembered that association will decrease or increase simply according as

$$s_1 s_3 \leq s_2 s_4,$$

$s_1 s_2 s_3 s_4$  being the survival rates in the four classes AB, A $\beta$ , &c. (*vide* § 54).



§ 66. We have no material, as already stated, for testing the effect of pure selection with any absolute certainty. The greater number of the deaf and dumb, however, possess their defect from birth or early childhood, and the same statement holds good for imbeciles or idiots as distinct from the insane. Hence the association between deaf-mutism and imbecility will be affected by selection (selective mortality) to a large extent, at all events, as compared with those associations that were given in Table VIII. The necessary data for discussing the association in this case are given in the English Census for 1881 (*loc. cit.*, note on p. 298), and the results are tabulated in Table IX. The figures for males show a steady and continuous decrease in association, without a break; for females there is, on the whole, a decrease, but it is less regular.\* Taking both sexes together, I think the decrease in association is rather greater for dumbness and imbecility than for dumbness and mental derangement. Thus Table IX. seems to point to selection causing *decrease* of association. This is the only evidence we have of at all a direct character, and so its results should be accepted pending the production of anything better. At the same time the material is obviously not unimpeachable, and an endeavour should be made to get reliable statistics for the special purpose.†

*Differences between the Sexes.*

§ 67. The differences exhibited by the sexes as regards association are so marked that they can hardly have failed to have struck the reader of the foregoing tables. In an immense majority of cases the association is greater for females than for males—dealing only with the total associations that is to say.‡ This is true for all divisions of one material, and for the Census defects as well as for those dealt with by Dr. WARNER. The evidence is collected in Table X., which is based entirely on the preceding tables. In 87 cases out of 101, or 86 per cent., the associations are greater for females than for males. There seems some indication of a decrease in the difference with advancing age; thus in Standards IV.-Ex. VII. the females are only greatest in 3 cases of 6. In the age groups over 25, pooling Tables VII. and IX. together, the females only exceed in 71 per cent. of the cases, or 15 out of 21, instead of 86 per cent., or 18 out of 21.

§ 68. Besides being more highly associated, women are also in general less defective than men. They exhibit a smaller percentage of individuals with development defects, nerve signs, or mental dulness, but a slightly higher percentage with low

\* It will be noted that the age groups are not the same as in the last case, the figures being grouped more coarsely in the 1881 Census.

† Professor PEARSON informs me that unpublished material in his hands goes to show that correlation decreases with age; theoretically also he would expect selection to decrease correlation.

‡ This is again in accord with the evidence for correlation—females being more highly correlated than males.



TABLE VIII.—Showing the Associations between Blindness, Deaf-mutism, and Mental Derangement for both Sexes and different Age Groups; and the proportion per 100,000 of Deaf, Dumb, and Mentally Deranged. (Census of England and Wales, 1891.)

The sign of the association is +, if not entered.

Association between	All ages.	5—		15—		25—		35—		45—		55—		65—		75—			
		Male	Female	Male	Female	Male	Female	Male	Female	Male	Female	Male	Female	Male	Female	Male	Female		
Association between	Blindness and dumbness	Male	.769 ± .019	.893 ± .022	.792 ± .051	.866 ± .028	.625 ± .103	.747 ± .057	.697 ± .072	.597 ± .109	.698 ± .089								
		Female	.842 ± .013	.937 ± .013	.796 ± .062	.859 ± .040	.886 ± .026	.890 ± .024	.835 ± .024	.701 ± .078	.662 ± .087								
		Female	.648 ± .015	.921 ± .013	.753 ± .034	.607 ± .049	.572 ± .041	.459 ± .048	.412 ± .049	.198 ± .070	.126 ± .111								
Association between	Mental derangement and dumbness	Male	.853 ± .005	.912 ± .008	.804 ± .020	.866 ± .011	.789 ± .019	.823 ± .017	.815 ± .021	.797 ± .033	.622 ± .148								
		Female	.826 ± .007	.931 ± .009	.846 ± .017	.828 ± .017	.800 ± .019	.746 ± .027	.752 ± .031	.802 ± .030	.808 ± .043								
		Female																	
Proportion per 100,000 of population in same age group	Blind . . . .	Male	87	26	44	56	93	147	247	435	1051								
		Female	75	22	32	37	58	113	186	396	1119								
		Female	55	68	59	56	62	58	57	53	44								
Proportion per 100,000 of population in same age group	Dumb . . . .	Male	43	50	49	45	50	46	45	42	43								
		Female	323	85	229	246	572	687	753	769	679								
		Female	348	62	173	376	602	806	906	946	976								

Diagrams Illustrating the Change in Association of Defects during Life (Table VIII.).

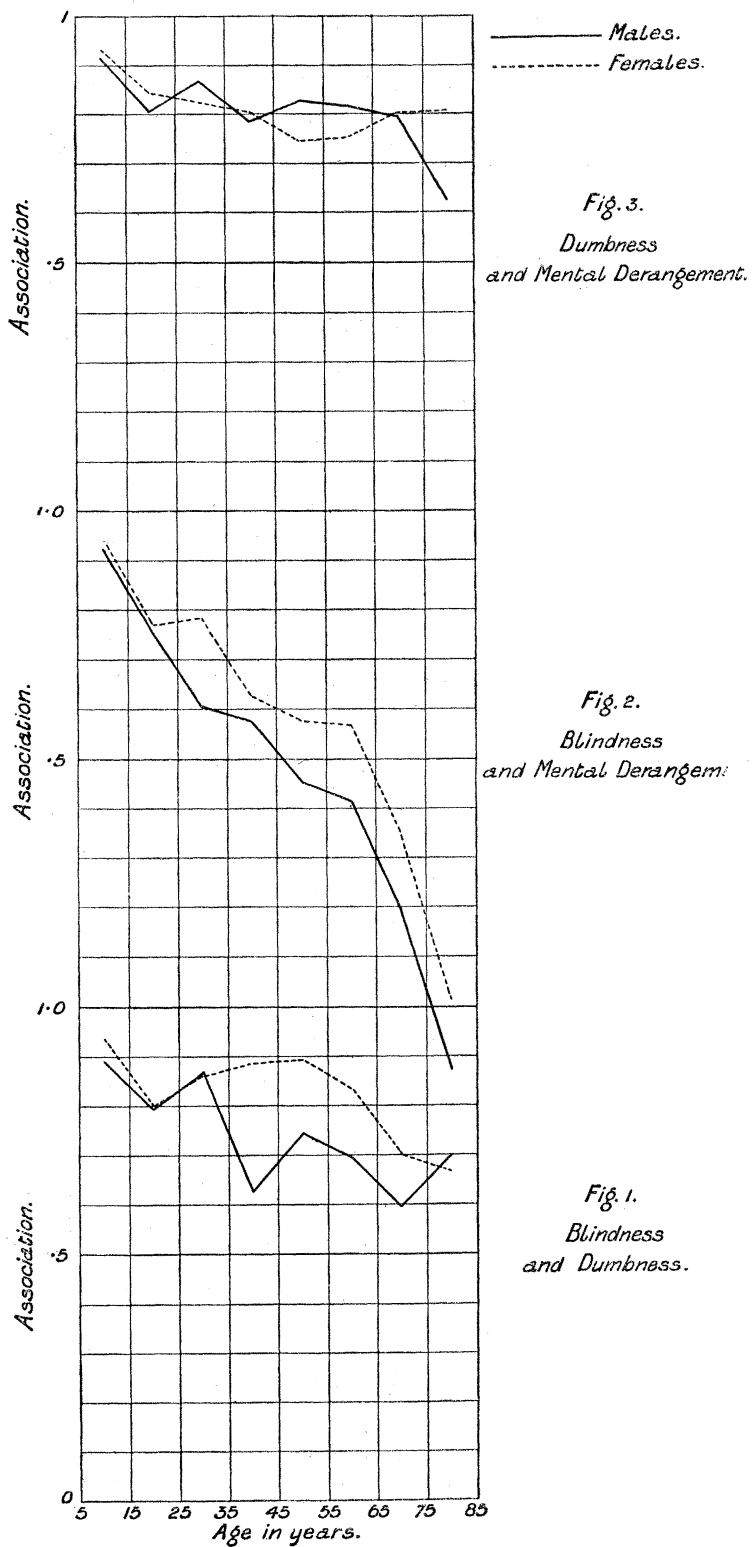


TABLE IX.—Showing the Association between Imbecility or Idiocy and Deaf-mutism for both Sexes and successive Age Groups; and the proportion per 100,000 of Imbeciles and Deaf-mutes.

			All ages.	5—	15—	25—	45—	65—.
Association between imbecility and dumbness. . . }		Male	$\cdot 924 \pm \cdot 003$	$\cdot 943 \pm \cdot 005$	$\cdot 931 \pm \cdot 006$	$\cdot 907 \pm \cdot 008$	$\cdot 889 \pm \cdot 014$	$\cdot 482 \pm \cdot 184$
		Female	$\cdot 913 \pm \cdot 004$	$\cdot 953 \pm \cdot 005$	$\cdot 878 \pm \cdot 015$	$\cdot 890 \pm \cdot 010$	$\cdot 910 \pm \cdot 010$	$\cdot 770 \pm \cdot 053$
Proportion per 100,000 in same age group.	Deaf and dumb }	Male	56	63	65	63	61	61
		Female	46	55	51	52	47	52
	Imbeciles or idiots }	Male	128	97	174	156	149	217
		Female	125	67	136	161	186	273

nutrition.\* In the case of Census defects (Tables VIII. and IX.), the proportion per 100,000 living at all ages is less for females in blindness, deaf-mutism, and imbecility, but greater for females in the case of general mental derangement. Comparing the separate age groups the proportion per 100,000 living at each age is least for females in every case at age groups under twenty-five. In the older age groups, on the other hand, in the cases of mental derangement and imbecility, the females show the greater proportion of defectives.

Thus at first sight it would appear that the female, though at first a greatly superior animal to the male, was liable to break down mentally at a much more rapid rate and at an earlier age. This, however, would probably be a fallacious conclusion; it is pointed out in the Census Report for 1881 that the death-rate for male lunatics is known to be very much higher than for female lunatics—almost half as high again in fact.† Hence the greater proportion per 1000 living at the later age groups may, either entirely or to a large extent, be simply due to accumulation. There is apparently no evidence that the *case-rate* is greater for females at the higher age groups. Thus, so far as we can say at present, the female may remain the less defective animal throughout life.

§ 69. Summarising the general conclusions, I have shown good ground for accepting as general laws that females are more highly associated than males, and that

\* Cf. Table VI., p. 54, for a comparison in each separate Standard.

† General Report for 1881, pp. 66–67 :—“According to the returns of the Lunacy Commissioners from 1872 to 1881 inclusively, the mean annual death-rate among the registered male insane was 11·94 per cent. of the average daily number on the register, while the death-rate of the females was 8·13 per cent. The recovery rate of the males was 10·50 per cent., and that of the females 11·59 per cent.”

TABLE X.—Showing the number of Cases in which the Association between Defects is greater for Males and greater for Females (based on preceding tables).

* Number of cases in which the association is greater.	Table I.		Table II.				Table III.		
	1888-1891.	1892-1894.	Certified industrial schools.	Poor Law schools.	Homes and orphanages.	Public elementary.	English.	Jews.	Irish.
For males . . . . .	—	—	1	1	1	—	1	—	—
For females . . . . .	6	6	5	5	5	6	5	6	6

* Number of cases in which the association is greater.	Tables IV. and V.			Table VIII.			Table IX.		Total.
	Infants.	Standards I.-III.	Standards IV.-VII.	5-25	25-45	45-.	5-25	25-.	
For males . . . . .	—	—	3	—	2	3	1	1	14
For females . . . . .	6	6	3	6	4	9	1	2	87

\* Total associations only.

associations are greater for the young than the old. I have not, however, been able to say with certainty whether the decrease in association was due to growth (change in the individual) aided by selection, or growth opposed by selection. The only available evidence suggested that selection acted in the same direction as growth.

The total associations between defects were always high, except in some cases for the very old, but the partial associations for defective universes were in most cases low, and in some cases even certainly negative. The partial associations for un-defective universes were, on the other hand, higher than the total coefficients, a fact which I held to imply that no one of the defects recorded was necessary as a connecting link between any other pair.

§ 70. During the course of the present investigation I have naturally been led to study pretty thoroughly the "Report" of the Committee on Childhood, and the papers by Dr. WARNER, bearing on the same subject, in the 'Journal of the Royal Statistical Society'—papers which first drew my attention to the need of a theoretical study of the whole subject of association. I may be pardoned, then, for offering some suggestions as to the work of the Committee as regards both the mode

of publication or arrangement of its results, and the directions in which future work might possibly be undertaken.

To deal with the questions of arrangement, &c., first. I suggest that the notation might with great advantage be altered to the notation of JEVONS, such as I have used. The shortcomings of a notation which has to represent the simple second-order frequency  $(A\beta)$  by  $(A+) - (AB+)$  are obvious. Next, I have noticed that the arrangement of frequencies is very irregular in the report. Where the ultimate fourth-order frequencies (Dr. WARNER'S "Primary" groups) alone are given it is quite clear, but where more are given the data are seldom complete, and groups of the same order are not kept together. As an example of the way in which I think frequencies ought to be given I append a table giving the general results of the 1892-94 investigation. If so much space could not be spared, I think the statement of the fourth-order frequencies is quite sufficient, as the others can be so readily calculated from them.\*

As regards future work, I find myself unable to follow at all the remarks made by the Committee on p. 5 of the "Report" (the italics are mine):—

"A very valuable addendum to vital statistics might be obtained by following up the history of certain cases recorded, by subsequent periodical inspections, but *as this is beyond the power of the present Committee*, it can only be suggested as one among many other directions in which enquiry may be pushed in the hands of official Commissions."

The Committee—or Childhood Society—is, as I gather from its Reports, continuing the work of inspecting children in schools, and why it should be "beyond their power" to reinspect a few large schools year by year is by no means obvious. They are at present (in the last Reports,† for 1898-99) issuing statistics of the frequencies of different groups of defects for different ages. As I have already pointed out (note on p. 304) these statistics are rendered almost worthless by the omission of the frequency  $(\alpha\beta\gamma\delta)$ —the number of *undefective* children—at each age, only those who were defective having apparently been noted. Even if the material were, however, complete, it would not enable us to distinguish between changes due to selection and changes due to growth, nor consequently to state what are the effects of these agencies each by itself. Nothing but observance of one group of individuals year by year can do this, and there seems little more difficulty in this than in the work already being carried out. It is surely futile to expect a Royal Commission on the subject. It would, in fact, be more appropriate for a body, specially created for the "Scientific Study" of childhood, to take up an investigation of the greatest scientific interest but probably of little immediate practical use. I would most strongly urge the

\* There appear to be a good many misprints in the Report, many of the frequencies being in disagreement with those given for the ultimate ("Primary") groups. I have generally assumed the "primary" frequencies to be correct.

† British Association Reports, 1898, p. 691 ; 1899, p. 489.



TABLE showing the Frequencies of all Groups of Defects. All Ages.  
(1892-94 investigation.)

Group.	Frequency.		Group.	Frequency.		Group.	Frequency.	
	Boys.	Girls.		Boys.	Girls.		Boys.	Girls.
$\alpha\beta\gamma\delta$	21,511	20,207	$\alpha\beta\gamma$	21,842	20,504	$\alpha\beta$	22,013	20,667
$A\beta\gamma\delta$	802	445	$\alpha\beta\delta$	21,619	20,317	$\alpha\gamma$	23,604	21,753
$\alpha B\gamma\delta$	1,059	762	$\alpha\gamma\delta$	22,570	20,969	$\alpha\delta$	22,793	21,188
$\alpha\beta C\delta$	108	110	$\beta\gamma\delta$	22,313	20,652	$\beta\gamma$	23,038	21,263
$\alpha\beta\gamma D$	331	297	$A\beta\gamma$	1,196	759	$\beta\delta$	22,555	20,924
$AB\gamma\delta$	415	207	$A\beta\delta$	936	607	$\gamma\delta$	23,787	21,621
$A\beta C\delta$	134	162	$A\gamma\delta$	1,217	652	$A\beta$	1,421	1,031
$A\beta\gamma D$	394	314	$B\gamma\delta$	1,474	969	$A\gamma$	1,934	1,190
$\alpha BC\delta$	115	109	$\alpha B\gamma$	1,762	1,249	$A\delta$	1,420	891
$\alpha B\gamma D$	703	487	$\alpha B\delta$	1,174	871	$\alpha B$	1,966	1,428
$\alpha\beta CD$	63	53	$\alpha\beta C$	171	163	$B\gamma$	2,500	1,680
$ABC\delta$	69	77	$\alpha C\delta$	223	219	$B\delta$	1,658	1,155
$AB\gamma D$	323	224	$\beta C\delta$	242	272	$\alpha C$	375	342
$A\beta CD$	91	110	$\alpha\beta D$	394	350	$\beta C$	396	435
$\alpha BCD$	89	70	$\beta\gamma D$	725	611	$C\delta$	426	458
$ABCD$	80	79	$\alpha\gamma D$	1,034	784	$\alpha D$	1,186	907
Total .	26,287	23,713	$AB\gamma$	738	431	$\beta D$	879	774
			$AB\delta$	484	284	$\gamma D$	1,751	1,322
			$A\beta C$	225	272	$AB$	887	587
			$AC\delta$	203	239	$AC$	374	428
			$A\beta D$	485	424	$AD$	888	727
			$A\gamma D$	717	538	$BC$	353	335
			$\alpha BC$	204	179	$BD$	1,195	860
			$BC\delta$	184	186	$CD$	323	312
			$B\gamma D$	1,026	711	$A$	2,308	1,618
			$\alpha BD$	792	557	$a$	23,979	22,095
			$\alpha CD$	152	123	$B$	2,853	2,015
			$\beta CD$	154	163	$\beta$	23,434	21,698
			$ABC$	149	156	$C$	749	770
			$ABD$	403	303	$\gamma$	25,538	22,943
			$ACD$	471	189	$D$	2,074	1,634
			$BCD$	169	149	$\delta$	24,213	22,079
						Total .	26,287	23,713

importance of such reinspections of the same children on the Childhood Society and the Committee of the British Association that corresponds with it.

As a further subject, I suggest the question as to the hereditary character of these defects—development defects, nerve signs, low nutrition, and mental dulness—not necessarily by studying the parents, which would probably be a difficult matter, but by noting pairs of brothers. Suppose a large number of groups of brothers\*—"fraternities"—to be noted for some defect, say A; reckon for each

\* Or, of course, sisters; or brothers and sisters, "geschwister," "siblings" as Professor PEARSON has proposed to call them, since we have no modern English word for members of the same family without regard to sex.

fraternity the number of  $AA$ ,  $A\alpha$ ,  $\alpha A$ , and  $\alpha\alpha$  pairs, as in the example on “Temper in Fraternities,” p. 291, and tabulate the total number of such separate pairs as in that example. These numbers give the association between brothers at once.

A certain portion of such fraternal association might be due to similarity of environment for the brothers, if the defects observed were much affected by this. I do not see how the home-environment could be allowed for, but it could be tested whether the environment of school had any such effect. Take from a considerable number—say 100—different schools a series of samples, say 50 or 100 children from each. Each of these groups forms what we may call a “community” or group subjected to common conditions, as opposed to the fraternity. Find the association between members of the Community in just the same way as the association between members of the Fraternity. This would give a measure of the effect of environment as opposed to inheritance. Possibly this might be done with the material now in the hands of the Society.