# NOTES ON PROBABILITY AND INDUCTION* 

## INTRODUCTORY REMARKS

## I. The Three Main Conceptions of Probability

(1) The classical conception (Bernoulli, Bayes, Laplace).
(2) The frequency conception (Mises, Reichenbach; mathematical statistics).
(3). The logical conception (Keynes, Jeffreys).

Read: Nagel [37]

## II. The Two Explicanda

There are two explicanda, both called 'probability':
(1) logical or inductive probability ( probability $_{1}$ ),
(2). statistical probability (probability ${ }_{2}$ ).

Read: [Prob.] Ch. II, esp. §§ 9 and 10.
The logical concept of probability appears in three forms ([Prob.] § 8):
(a) the classificatory concept (confirming evidence),
(b) the comparative concept (higher confirmation),
(c) the quantitative concept (degree of confirmation).

## III. Preliminary Remarks on Inductive Logic

Read: [Prob.] Ch. IV. In particular:
(1) Logical probability (as explicandum) is explained as a fair betting quotient, and as an estimate of relative frequency ([Prob.] § 41).
(2) If logical probability is used, no synthetic assumption (e.g., uniformity of the world) is needed as presupposition for the validity of the inductive method ([Prob.] § 41 F ).
(3) Comparison of inductive and deductive logic ([Prob.] § 43).
(4) The main kinds of inductive inference ([Prob.] § 44 B)
(a) direct inference (from the population to a sample),

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(b) predictive inference (from one sample to another),
(c) inference by analogy,
(d) inverse inference (from a sample to the population),
(e) universal inference (from a sample to a universal law).
(5) The use of inductive logic for the choice of a practical decision ([Prob.] §§ 50, 51). The rule of maximizing the estimate of utility. Daniel Bernoulli's law of utility.


## IV. Some Concepts of Deductive Logic

Read: [Prob.] §§ 14-20, esp. 18-20.
(1) State-descriptions (Z, § 18A; comp. individual distributions, D 26-6a). A statedescription describes a (possible) state or model.
(2) The requirement of the logical independence of the primitive predicates (§ 18B) can be abandoned if the dependences are expressed by meaning postulates (see [15].)
(3) Families of related primitive predicates (§ 18C).
(4) The range of a sentence (§§ 18D, 19).
(5). $L$-concepts (§ 20). I write ' $-i$ ' for ' $i$ is L-true', and hence ' $\mid ~ i \supset j$ ' for ' $i$ L-implies $j$ ', and ' $\mathrm{i} \mathrm{i} \equiv \mathrm{j}$ ' for ' $i$ is L-equivalent to $j$ '.

In simple languages (e.g., those used in [Prob.]) every model is describable by a statedescription. In richer languages this is not possible; here the definitions of L-concepts and degree of confirmation are to be based on models rather than state-descriptions.

## THE THEORY OF DEGREE OF CONFIRMATION

## V. Fundamental axioms (Al-A5)

The axioms apply to any sentences $e$ and $h$ in a given language $L$ (finite; or infinite). We presuppose throughout that the second argument of $c$ (usually $e$ ) is not L-false (see [Prob.] pp. 295f.).

Al. Range of values. $0 \leq c(h, e) \leq 1$.
A2. $\quad L$-implication. If $\mid e \supset h$, then $c(h, e)=1$.
A3. Specialaddition principle. If $e \cdot h \cdot h^{\prime}$ is L-false, then $c\left(h \vee h^{\prime}, e\right)=c(h, e)+c\left(h^{\prime}, e\right)$.
A4. General multiplication principle. $c\left(h, h^{\prime}, e\right)=c(h, e) \times c\left(h^{\prime}, e . h\right)$.

A5. L-equivalent arguments. If 卜 $e \equiv e^{\prime}$ and $\vdash=h \equiv h^{\prime}$, then $c(h, e)=c\left(h^{\prime}, e^{\prime}\right)$.
(These axioms, except for A5, are those of Shimony [47]. They are together equivalent to the Conventions C53-1 and 2 in [Prob.] § 53. Most axiom systems of other authors are essentially equivalent to this one; see [Prob.] § 62.) The usual theorems of the probability calculus are provable on the basis of these axioms. Among them are the theorems [Prob.] T53-1a to f . (' $t$ ' is the tautology.)

## VI. Regular m-Functions and c-Functions (A6)



Deductive logic
' $e$ L-implies $h$ ' means that the range of $e$ is entirely contained in that of $h$.


Inductive logic
' $c(h, e)=3 / 4$ ' means that three-fourths of the range of $e$ is contained in that of $h$. ([Prob.] § 55B.)

Fig. 1.
For degrees of confirmation (d. of c.) we need a measure function for the ranges of sentences. For this purpose we define regular $m$-functions ([Prob.] 55A).
DI. $\quad m$ is a regular $m$-function for $L_{N}={ }_{\mathrm{Df}}$
(a) for every $Z_{i}$ in $L_{N}, m\left(Z_{i}\right)>0$;
(b) $\sum_{i} m\left(Z_{i}\right)=1$;
(c) if $j$ is L-false, $m(j)=0$;
(d) if $j$ is not L-false, $m(j)=\sum m\left(Z_{i}\right)$ for all $Z_{i}$ in the range of $j$.

D2. $\quad c$ is a regular $c$-function for $L_{N}={ }_{\text {Df }}$ there is a regular $m$-function $m$ such that $c$ is based upon $m$, i.e.

$$
c(h, e)=\frac{m(e . h)}{m(e)} .
$$

A6. Regularity. In a finite domain of individuals, $c(h, e)=1$ only if $卜 e \supset h$.
(This axiom corresponds to [Prob.] C53-3.)
Null confirmation is the d . of c . on the tautological evidence $t$ ([Prob.] D57-1, where the symbol ' $c_{0}$ ' is used):

D3. $\quad c_{t}(j)={ }_{\mathrm{Df}} c(j, t)$
T1. A $c$-function $c$ for $L_{N}$ satisfies the axioms Al-A6 if and only if $c$ is a regular $c$ function.

Proof. 1. Let $c$ be a regular $c$-function for $L_{N}$. Then $c$ satisfies Al-A6 according to [Prob.] T59$1 \mathrm{a}, 1 \mathrm{~b}, 11,1 \mathrm{n}, 1 \mathrm{~h}$ and $\mathrm{i}, \mathrm{T} 59-5 \mathrm{a}$, respectively. 2. Let $c$ satisfy Al-A6. Then $c_{t}$ is a regular $m$ function (by [Prob.] C53-3 and T53-1). $c$ is based upon $c_{t}$ (comp. [Prob.] § 54B, (3)). Therefore $c$ is a regular $c$-function.

According to Tl , the theorems stated in [Prob.] §§ 55, 57A and B, 59, 60, and 61 for regular $c$-functions in finite systems $\mathrm{L}_{N}$ are provable on the basis of Al to A6.

If $c$ satisfies Al to A5, but not A6, we shall call it a quasi-regular $c$-function (not in [Prob $j)$. In this case, $c_{t}$ is 0 for some $Z_{i}$; therefore, even in $L_{N}, c(h, e)$ cannot always be represented as $c_{t}(e \cdot h) / c_{t}(e)$.
(Example: the straight rule, [Prob.] p. 227.)
The following theorems are provable on axioms Al to A5; hence they hold for all regular or quasi-regular $c$-functions.

T2. $\quad c(h, e) \times c(i, e . h)=c(i, e) \times c(h, e . i)$. (From A4, A5.).
T3. General division theorem, in two forms.
a. If $c(i, e)>0$, then $c(h, e . i)=\frac{c(h, e) \times c(i, e . h)}{c(i, e)}$ (From T2.)
b. If $c(i, e)>0$ and $c(h, e)>0$, then $\frac{c(h, e . i)}{c(h, e)}=\frac{c(i, e . h)}{c(i, e)}$ (From (a).).

The fraction on the left-hand side of the equation is known as the
relevance quotient; the numerator is the posterior confirmation of $h$ and the denominator is the prior confirmation of $h$.

T4. Special division theorem. Suppose that $c(i, e)>0, c(h, e)>0$, and $c(i, e . h)=1(i$ is predictable or explainable by $h$ ). Then

$$
\frac{c(h, e \cdot i)}{c(h, e)}=\frac{1}{c(i, e)}(\text { From T3b }) .
$$

See the explanations and examples for these theorems in [Prob.] §§ 60 and 61.

## VII. Coherence

Informal explanation. Let $X$ be willing to accept any system of bets in which the betting quotients are equal to the values of a function $c$. If there were a betting system such that $X$ would suffer a loss in every logically possible case, $c$ would obviously be unsuitable. If there is no such betting system, we shall call c coherent (Ramsey, De Finetti). If, moreover, there is no betting system such that $X$ would lose in at least on possible case and would not gain in any possible case, we shall call $c$ strictly coherent (Shimony).

We assume for the following definitions that L is an interpreted language, that $e$ and $h$ are sentences of L , that $e$ is not L-false, that $c$ is a function whose value for any $h, e$ is a real number, and that $q$ and $S$ are real numbers (and likewise for $e_{i}, h_{i}, q_{i}, S_{i}$ ).

We represent a bet (of the person $X$ ) on $h$, given $e$, in language $L$, with the betting quotient $q$ and the total stake $S$ as the ordered quintuple $<\mathrm{L}, h, e, q, S>$ (without reference to $X$ ):
DI. $\quad B$ is a bet $={ }_{\text {Df }}$ for some L $, h, e, q$, and $S, B=<\mathrm{L}, h, e, q, S>$.

We represent a betting system BS based on the assumption $k$ and comprising the bets $B_{1}, B_{2}, \ldots$, $\mathrm{B}_{\mathrm{n}}$ in language L , in accordance with $c$ (i.e., the betting quotients are determined by the values of $c$ ) as the ordered quadruple $<\left\{\mathrm{B}_{1}, \ldots, \mathrm{~B}_{\mathrm{n}}\right\}, \mathrm{L}, k, c>$ :

D2. $\quad \mathrm{BS}$ is a betting system $={ }_{\mathrm{Df}} \mathrm{BS}=<K, \mathrm{~L}, k, c>$, where $K=\left\{B_{i}\right\}(i=1, \ldots, n), B_{i}=$ $<\mathrm{L}, h_{i}, e_{i}, q_{i}, S_{i}>, k$ is a non-L-false sentence in L , each $e_{i}$ is either $k$ or a conjunction containing $k$ as a component and is not L-false, and $q_{i}=c\left(h i, e_{i}\right)$.

If $X$ regards a bet on $h$, given $e$, with betting quotient $q$ as fair, then he is willing to make a corresponding bet on either side, i.e., either for $h$ or against $h$. If $e$ is true, the gains are as follows (with $S>0$ ):

|  |  | Gain |  |
| :---: | :---: | :---: | :---: |
|  | $h$ | for $h$ | against $h$ |
| (a) | true | $(1-q) S$ | $-(1-q) S$ |
| (b) | false | $-q S$ | $q S$ |

Thus $X$ 's bet against $h$ can be regarded as a bet for $h$ with negative $S$. Therefore we admit $S \leq \geq$ 0 ; then D3 covers both bets, for $h$ and against $h . g(B, j)$ is the gain which $X$ would obtain from his bet $B$ if $j$ were true.

D3. Let $B$ be a bet $<\mathrm{L}, h, e, q, S>$. Let $j$ be a non-L-false sentence in L which Limplies $\quad$ either $e$ or $\sim e$ and L-implies either $h$ or $\sim h . g(B, j)={ }_{\text {Df }}$ the value $u$ such that
either (a) $-j \supset e \cdot h$, and $u=(1-q) S$, or (b) $-j \supset e . \sim h$, and $u=-q S$, or $\quad$ (c) $-j \supset \sim e$, and $u=0$.

We define $G(\mathrm{BS}, j)$ as the total gain from the betting system BS which $X$ would obtain if $j$ were true:

D4. Let BS be $<\left\{B_{i}\right\}, \mathrm{L}, k, c>(i=1, \ldots, n)$. Let $j$ be a non-L-false sentence in L such that, for every $i, j$ L-implies either $e_{i}$ or $\sim e_{i}$, and $j$ L-implies either $h_{i}$ or $\sim h_{i}$. Then $G(\mathrm{BS}, j)={ }_{\mathrm{Df}} \sum_{i=1}^{n} g\left(B_{i}, j\right)$.

Let BS be $<\left\{B_{i}\right\}, \mathrm{L}, k, c>$. Let $C_{\mathrm{BS}}$ be the class of the conjunctions $j$ such that (1) $j$ contains as components, for each of the sentences $e_{1}, \ldots, e_{n}, h_{1}, \ldots, h_{n}$, either the sentence itself or its negation but not both, and no other components, and (2) $j$ is compatible with $k$. These conjunction represent the possible cases on the basis of the assumption $k$. We shall say that for a given BS loss is necessary if, for every conjunction $j$ in $C_{\mathrm{BS}}, G(\mathrm{BS}, j)<0$; that loss is possible if, for at least one $j$ in $C_{\mathrm{BS}}, G(\mathrm{BS}, j)<0$; and that positive gain is impossible if, for every $j$ in $C_{\mathrm{BS}} G(\mathrm{BS}$, $j) \leq 0$. We shall say that BS is vacuous if, for every $j, G(\mathrm{BS}, j)=0$.

D5. $c$ is a coherent $c$-function for $\mathrm{L}={ }_{\mathrm{Df}}$ there is no betting system in L in accordance with $c$ for which loss is necessary (in other words, for every betting system there is a possible outcome without loss).

D6. $\quad c$ is a strictly coherent $c$-function for $\mathrm{L}={ }_{\mathrm{Df}}$ there is no betting system in L in accordance with $c$ for which loss is possible and positive gain is impossible (in other words, for every non-vacuous betting system there is a possible outcome with positive gain).

T1. If $c$ is strictly coherent, it is also coherent.
T2. (Ramsey, De Finetti.) Every coherent c-function satisfies the axioms A1 to A5. In other words, if $c$ violates at least one of the axioms Al to A5, then there is betting system in accordance with $c$ for which loss is necessary.

Example for A4. Suppose that $c$ violates A4 in L. Then there are sentences $e, h$, and $h^{\prime}$ in L such that

$$
c(h, e) \times c\left(h^{\prime}, e . h\right)-c\left(h . h^{\prime}, e\right) \neq 0 .
$$

Let $c_{1}=c(h, e), c_{2}=c\left(h^{\prime}, e . h\right), c_{3}=c\left(h . h^{\prime}, e\right)$, and let $c_{1} c_{2}-c_{3}=D$.
We choose the betting system $\mathrm{BS}=\left\langle\left\{B_{i}\right\}, \mathrm{L}, e, c>(i=1,2,3)\right.$,
TABLE I
Example for A4

|  | $B_{i}$ | $g\left(B_{i}, j\right)$ for the four conjunctions in $C_{\mathrm{BS}}$ |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $i$ | $e_{i}$ | $h_{i}$ | $S_{i}$ | $q_{i}$ | $e \cdot h \cdot h^{\prime}$ | $\mathrm{e} \cdot \mathrm{h} \cdot \sim \mathrm{h}^{\prime}$ | $e \cdot \sim h \cdot h^{\prime}$ <br> $e \cdot \sim h \cdot \sim h^{\prime}$ |
| 1 | e | $h$ | $\frac{c_{2}}{D}$ | $c_{1}$ | $\frac{\left(1-c_{1}\right) c_{2}}{D}$ | $\frac{\left(1-c_{1}\right) c_{2}}{D}$ | $\frac{-c_{1} c_{2}}{D}$ |
| 2 | $e \cdot h$ | $h^{\prime}$ | $\frac{1}{D}$ | $c_{2}$ | $\frac{1-c_{2}}{D}$ | $\frac{-c_{2}}{D}$ | 0 |
| 3 | $e$ | $h \cdot h^{\prime}$ | $\frac{-1}{D}$ | $c_{3}$ | $\frac{-\left(1-c_{3}\right)}{D}$ | $\frac{c_{3}}{D}$ | $\frac{c_{3}}{D}$ |
| $G(\mathrm{BS}, j)=$ |  |  |  |  |  |  |  |
| -1 | -1 | -1 |  |  |  |  |  |

with $e$ as $k$, and with $e_{i}, h_{i}$, and $S_{i}$ as specified in the table below. (See Table I.) By D2, $q_{i}=c\left(h_{i}\right.$, $e_{i}$ ). The values of $g$ are determined by D 3 , and those of $G$ by D 4 . We find that, for every $j, G=$ -1 . Thus for the chosen BS, loss is necessary. This betting system is described in Table I.

T3. (Shimony.) If $c$ violates A6, then there is a betting system in accordance with $c$ for which loss is possible and positive gain is impossible. Therefore every strictly coherent $c$-function satisfies the axioms Al to A6.

Proof. Suppose that $c$ violates A6 in $\mathrm{L}_{N}$. Then there are sentences $e, h$ in $\mathrm{L}_{N}$ such that $c(h$, $e)=1$ but $e$ does not L-imply $h$, hence $e, \sim h$ is not L-false. We take a system of one bet $<\mathrm{L}_{N}, h$, $e, c(h, e), 1>$, and again $e$ as $k$. The two possible cases $j$ are $e . h$ and $e . \sim h$. The gain is 0 in the first case, and -1 in the second. Thus loss is possible and positive gain is impossible. This applies to any quasi-regular $c$-function, e.g. to the straight rule (VI).

T 2 gives a validation for the axioms Al to A5, T 3 for A6. The following theorem shows that an analogous validation is not possible for any further axioms. (The proof for T4 is given by Kemeny in his paper [34].)

T4. (Kemeny) a. Every $c$-function in L which satisfies the axioms Al to A 5 , is coherent in L.
b. Every $c$-function in L which satisfies the axioms Al to A 6 , is strictly coherent in L .

T5. a. A $c$-function is coherent if and only if it is regular or quasi-regular.
b. A $c$-function is strictly coherent if and only if it is regular. (From T2, T3, T4, and VI-T1.)

The classification of $c$-functions defined by T4 and T5 can be presented in the form of the following table:

| Axioms satisfied |  | Type of $c$-function |  |
| :--- | :--- | :--- | :--- |
| A1 to A5 | A6 | regular <br> strictly coherent | coherent |
|  | not A6 | quasi-regular |  |

## VIII. Symmetrical c-Functions (A7)

The system Al to A 6 is very weak. It determines no value of $c(h, e)$ except 0 or 1 in special cases. For any pair of factual sentences $e, h$ such that $e$ L-implies neither $h$ nor $\sim h$, the system does not exclude any number between 0 and 1 as a value of $c(h, e)$ ([Prob.] T59-5f, see remark on p . 323). Thus additional axioms are needed. A7 is the first of several axioms of invariance of $c(h, e)$ with respect to certain transformations of $e$ and $h$. These axioms represent the valid core of the classical principle of indifference. Axiom of symmetry (with respect to individuals):

A7. $\quad c(h, e)$ is invariant with respect to any permutation of the individuals.
DI. $m$-functions and $c$-functions which satisfy A7 are said to be symmetrical (with respect to individuals). (See [Prob.] §§ 90, 91.)

Read the definitions and explanations of the following concepts in [Prob.] : Ch. III: division (D25-4), isomorphic sentences (D26-3) and isomorphic state-descriptions (§ 27), individual and statistical distributions (D26-6), structures (§ 27) and structure-descriptions (Str, D27-1), Qpredicates (§ 31) and Q-numbers (§ 34).

Henceforth it is assumed, unless the contrary is stated, that $c$ satisfies Al to A7 and hence is regular and symmetrical. $m$ is $c_{t}$, hence $c$ is based on $m$.

T1. Let $e$ be isomorphic to $e^{\prime}$, and $h$ to $h^{\prime}$.
a. $c(h, e)=c\left(h^{\prime}, e^{\prime}\right)$. (From A7).
b. $m(h)=m\left(h^{\prime}\right)$. (From (a)).

T2. Let $i$ be an individual distribution for $n$ given individuals with respect to the division $M_{1}, \ldots, M_{\mathrm{k}}$, with the cardinal numbers $n_{1}, \ldots, n_{k}$.
a. The numbers of the individual distributions for the same $n$ individuals which are isomorphic to $i$ is

$$
\zeta_{i}=\frac{n!}{n!\ldots n_{k}!}([\text { Prob. }] \text { T40-32b. })
$$

b. Let $j$ be the statistical distribution corresponding to $i$. Then $m(j)=\zeta_{i} \times m(i)$. (From T1b).

T3 is a special case of T2.
T3. Let $\mathrm{L}_{N}$ be a language with $N$ individual constants and $k Q$-predicates. Let $Z_{i}$ be a state-description in $\mathrm{L}_{N}$ with the $Q$-numbers $N_{j}(j=1, \ldots, k)$.
a. The number of those state-descriptions in $L_{N}$ which are isomorphic to $Z_{i}$ is
$\zeta_{i}=\frac{N!}{N_{1}!N_{2}!\ldots N_{k}!} .($ From T2a. $)$
b. Let $\operatorname{Str}_{i}$ be the structure-description corresponding to $Z_{i}$. Then $m\left(S t r_{i}\right)=\zeta_{i} \times$ $m\left(Z_{i}\right)$. (From T2b.)

Therefore a regular and symmetrical $m$-function for $L_{N}$ is uniquely determined if we choose as its values for the structure-descriptions in $L_{N}$ arbitrary positive numbers whose sum is 1 . Then, for any $Z_{i,} m\left(Z_{i}\right)$ is determined by T3b and hence the other values by VI-D1c and d .

The subsequent theorems T4 to T6 on the direct inductive inference refer to the following situation. $e$ is a statistical distribution for $n$ given individuals (the 'population') in $L_{N}$ with respect to the division $M_{1}, M_{2}$ (which is non- $M_{1}$ ) with the cardinal numbers $n_{1}, n_{2} . r_{i}=n_{i} / n(i=1,2) . h$ is an individual distribution for $s$ of the $n$ individuals (the 'sample') with the cardinal numbers $s_{1}, s_{2}$ $\left(s_{i} \leq n_{i}\right) . h_{s t}$ is the statistical distribution corresponding to $h$.

T4. a. $c(h, e)=\frac{\left[\begin{array}{l}n_{1} \\ S_{1}\end{array}\right]\left[\begin{array}{l}n_{2} \\ S_{2}\end{array}\right]}{\left[\begin{array}{l}n \\ S\end{array}\right]}$.
(For $\left[\begin{array}{l}n \\ s\end{array}\right]$, see [Prob.] D40-3.)
b. $c\left(h_{s t}, e\right)=\frac{\binom{n_{1}}{S_{1}}\binom{n_{2}}{S_{2}}}{\binom{n}{S}}$
(For $\binom{n}{m}$, see D40-2.)
c. For given $e$ and $s, c\left(h_{s t}, e\right)$ has its maximum if $s_{1} / s$ is equal, or as near as possible, to $r_{1}$.
d. For fixed $s$, let $h_{p}(p=0, \ldots, s)$ be the statistical distribution $h_{s t}$ with $s_{1}=p$ and $s_{2}$ $=s-p$. Then

$$
\sum_{p=0}^{s}\left[p \times c\left(h_{p}, e\right)\right]=s r_{1}
$$

e. Let $j$ be a full sentence of ' $N_{1}$ ' with one of the $n$ individual constants in $e$. Then

$$
c(j, e)=r_{1} . \quad \text { (For proofs see [Prob.] T94-1.) }
$$

We see from T4d that, for given $s$, the estimate of $s_{1}$ on $e$ is $s r_{1}$. Hence the estimate of $s_{1} / s$ is $r_{1}$. T4e shows that $c$ for a singular prediction with ' $\mathrm{N}_{1}$ ' is $r_{1}$. Thus for the direct inference something analogous to the straight rule holds for all symmetrical regular (or quasi-regular) $c$-functions.

T5. The following holds approximately for sufficiently large $n, n_{1}$, and $n_{2}$. It holds exactly for $\lim c(n \rightarrow \infty)$ if $\lim \left(n_{i} / n\right)=r_{i}$.
a. $c(h, e)=r_{1}{ }^{s 1} \times r_{2}{ }^{s{ }^{2}}$.
b. Binomial law. $c\left(h_{s t}, e\right)=\binom{S}{S_{1}} r_{1}^{s 1} r_{2}^{s 2}$.

For proofs and explanations, see [Prob.] § 95.
We shall use the following notations in T6: $\sigma=\sqrt{s r_{1} r_{2}}$ ('standard deviation'); $\delta=s_{1}-s r_{1}$ (deviation of $s_{1}$ from its estimate); $\phi(u)=(1 / \sqrt{2 \pi}) e^{-u^{2} / 2}$ (the normal function; [Prob.] D40-4a); $h_{p}$ as in T4d; $h^{\prime}$ is the disjunction of sentences $h_{p}$ with $p$ running from $s r_{1}-\delta^{\prime}$ (or the integer nearest to it) to $s r_{1}+\delta^{\prime}\left(=s_{1}{ }^{\prime}\right)$; thus $h^{\prime}$ says that $s_{1}$ deviates from its estimate $s r_{1}$ to either side by not more than $\delta^{\prime}$, in other words, that $s_{1} / s$ (the relative frequency of $M_{1}$ in the sample) does not deviate from $r_{1}$ by more than $\delta^{\prime} / s$.

T6. The following holds approximately for sufficiently large $s$ and $n / s$.
a. The normal law.
$c\left(h_{s t}, e\right)=\frac{1}{\sigma \sqrt{2 \pi}} e^{-\delta^{2} / 2 \sigma^{2}}=\frac{1}{\sigma} \phi\left(\frac{\delta}{\sigma}\right)$.
b. Bernoulli-Laplace theorem
$c\left(h^{\prime}, e\right)=\int_{-\delta^{\prime} / \sigma}^{+\delta^{\prime} / \sigma} \phi(u) \mathrm{d} u$.
c. Bernoulli's limit theorem. For fixed $r_{1}$ and fixed $q=\delta^{\prime} / s, \lim _{s \rightarrow \infty} c\left(h^{\prime}, e\right)=1$.

T6c says the following. If the sample size $s$ increases but a fixed interval $r_{1} \pm q$ around the given $r_{1}$ is chosen, then $c\left(h^{\prime}, e\right)$ (i.e., the probability that the relative frequency of $M_{1}$ in the sample lies within the chosen interval) can be brought as near to 1 as desired by making the sample sufficiently large. For explanations and numerical examples, see [Prob.] § 96.

## IX. Estimation

Read: [Prob.] § 98 about the present situation of the problem of estimation.
Definition of the general estimate function.
Suppose that, on the basis of $e$, the magnitude $u$ has $n$ possible values: $u_{1}, \ldots, u_{n}$. Let $h_{i}$ say that $u$ has the value $u_{i}(i=1, \ldots, n)$. The $c$-mean estimate of $u$ is the weighted mean of the possible values, with their $c$-values as weights:

D1. $\quad e s t(u, e)=\operatorname{Df} \sum_{i=1}^{n}\left[u_{i} \times c\left(h_{i}, e\right)\right]$.
T1. $\quad A$ and $B$ are arbitrary fixed constants.
a. est $(A u, e)=A \times \operatorname{est}(u, e)$.
b. est $(u+B, e)=e s t(u, e)+B$.
c. est $(A u+B, e)=A \times$ est $(u, e)+B$.
([Prob.] T100-3,4, and 5).
Analogous results do not generally hold for a non-linear function of $u$. For example, in general est $\left(u^{2}, e\right) \neq \operatorname{est}^{2}(u, e)$. This leads to a paradox
in the practical application of estimates ([Prob.] § 100 C ). The paradox is eliminated if the rule for the determination of a decision refers to the estimate of only one magnitude, e.g., the gain or the utility resulting from an action.

Truth frequency. Let $K$ be a class of $s$ sentences $i_{1}, \ldots, i_{s}$. Let $t f(K)$ be the truth-frequency in $K$, i.e., the number of true sentences in $K$. Let $r t f(K)$ be the relative truth-frequency in $K$, i.e., if $(K) / s$.

T2. a. est $(t f, K, e)=\sum_{n=1}^{s} c\left(i_{n}, e\right)$. (For this proof. see [Prob.] T104-2a.)
b. $\operatorname{est}(r t f, K, e)=\frac{1}{s} \sum_{n=1}^{s} c\left(i_{n}, e\right)$. (From (a). T1a.)
c. If all sentences in $K$ have the same $c$-value on $e$, then the estimate of $r t f(K)$ is equal to this $c$-value. (From (b).)

The frequency of a property of individuals. Let $K$ be a class of $n$ individuals defined by enumeration. Let $a f(M, K)$ be the absolute frequency of $M$ in $K$, and $r f(M, K)$ the relative frequency, i.e., of $(M, K) / n$. Let $K^{\prime}$ be the class of the full sentences of $M$ with those individual constants which designate the individuals in $K$ Then

$$
a f(M, K)=t f\left(K^{\prime}\right) \quad \text { and } \quad r f(M, K)=r t f\left(K^{\prime}\right) .
$$

Therefore the results T2 on estimates of $t f$ and $r t f$ can now be applied to estimates of $a f$ and $r f$.
Direct estimation of frequency. This is based on the direct inference (see VIII-T4). Let $e$, $n, M_{1}, n_{1}, r_{1}, s$, and $s_{1}$ be as before (VIII-T4). Thus $e$ says that the $r f$ of $M_{1}$ in the population is $r_{1}$. Let $K$ be the class of the s individuals of the sample.

T3. a. est (af, $M, K, e)=s r_{1}$. (From VIII-T4d.)
b. $\operatorname{est}(r f, M, K, e)=r_{1}$. (From (a), T1a.)

Predictive estimation of frequency. Here the estimate depends on the chosen $c$-function. Let $e$ be any non-L-false sentence, $h$ a full sentence of $M$ for a new individual, and $K$ any finite, non-empty class of new individuals.

T4. est $(r f, M, K, e)=c(h, e)$. (From T2c.)
Thus the confirmation of a singular prediction with $M$ is equal to the estimate of $r f$ of $M$. This relation was used earlier for an informal explanation of inductive probability ([Prob.] § 41D).
X. The Functions $e^{\dagger}$ and $c^{*}$

In discussions on the principle of indifference, some authors have proposed to give equal a priori probabilities to all individual distributions (for a given domain of individuals and a given division of properties). Other authors have proposed the same for all statistical distributions. In our terminology, the controversy concerns the choice of one of the following two rules:
(A) All individual distributions have equal $m$-values.
(B) All statistical distributions have equal $m$-values.

However, each of these rules leads to contradictions if applied to different divisions (see the examples in [Continuum] p. 39).

Each of the rules becomes consistent if it is restricted to one division (for a given finite language), viz. the division of the $Q$-predicates, as follows:
(A') All state-descriptions have equal $m$-values.
(B') All structure-descriptions have equal $m$-values.
The function $c^{\dagger}$. There is exactly one symmetrical, regular $m$-function which fulfills ( $\mathrm{A}^{\prime}$ ), viz. $m^{\dagger}$ defined by Dl.

Let $\mathrm{L}_{N}$ be a language with $N$ individual constants and $k Q$-predicates.
T1. a. The number of state-descriptions in $L_{N}$ is $\zeta_{N}=k^{N}$. ([Prob.] T40-31c.)
b. The number of structure-descriptions in $L_{N}$ is

$$
\tau_{N}=\binom{N+k-1}{k-1}=\frac{(N+k-1)!}{N!(k-1)!} \cdot([\text { Prob.] T40-33b.) }
$$

Let $Z_{N}$ be any state-description in $L_{N}$ with the $Q$-numbers $N_{1}, . ., N_{k}$. We define:
D1. $m^{\dagger}\left(Z_{N}\right)={ }_{\operatorname{Df}} \frac{1}{k^{N}}$

D2. $\mathrm{c}^{\dagger}(\mathrm{h}, \mathrm{e})={ }_{\mathrm{Df}} \frac{m^{\dagger}(e . h)}{m^{\dagger}(e)}$.

Let $e_{N}$ be an individual distribution for any $N$ individuals for the division of the $k Q$ predicates with the same $Q$-numbers $N_{1}, \ldots, N_{k}$ (the same as in $Z_{N}$ ). Let $h_{j}$ be a full sentence of $Q_{j}$ for a new individual.

T2. a. $m^{\dagger}$ is regular and symmetrical. (From D1.)
b. $m^{\dagger}\left(e_{N}\right)=\frac{1}{k^{N}}$. (From D1, since $e_{N}$ is isomorphic to $Z_{N}$.)
c. $\mathrm{c}^{\dagger}\left(h_{j}, e_{N}\right)=1 / k$.

Proof. $e_{N} \cdot h_{j}$ is isomorphic to a state-description in $L_{N+1}$, hence $m^{\dagger}=1 / k^{N+1}$ (from Dl). The result is obtained by D2 and (b).

T2c shows that et $\left(h ;, e_{N}\right)$ is independent of $e_{N}$. It violates the principle of learning from experience and hence is unacceptable ([Prob.] p. 565). However, this function was proposed by C. S. Peirce, Keynes, and Wittgenstein.

The function $\mathrm{c}^{*}$. There is exactly one symmetrical, regular $m$-function which fulfills ( $\mathrm{B}^{\prime}$ ), viz. $m^{*}$ defined by D3.

D3. $m^{*}\left(Z_{N}\right)={ }_{\text {Df }} \frac{1}{\tau_{N} \zeta_{i}}$

$$
=\frac{N_{1}!\ldots N_{k}!(k-1)!}{(N+k-1)} .(\text { From T1b, VIII-T3a. })
$$

T3. a. For any structure-description in $L N, m^{*}=\frac{1}{\tau_{N}}$. Thus $m^{*}$ fulfills (B). (From VIII-T3b.)
b. $m^{*}$ is regular and symmetrical. (From D3.)
c. $m^{*}\left(e_{N}\right)=\frac{N_{1}!\ldots N_{k}!(k-1)!}{(N+k-1)}$. (From D3.)
$c^{*}$ is based on $m^{*}$ :
D4. $c^{*}(h, e)={ }_{\operatorname{Df}} \frac{m^{*}(e . h)}{m^{*}(e)}$.

T4. $\mathrm{c}^{*}\left(h_{j}, e_{N}\right)=\frac{N_{j}+1}{N+k}$.
Proof. $e_{N} . h_{j}$ is isomorphic to a state-description in $L_{N+1}$ with the $Q$-numbers $N_{1}, \ldots, N_{j}+1, \ldots, N_{k}$. Therefore its $m^{*}$-value is like that of $e_{N}$ in T3c, but with $N_{j}$ +1 instead of $N_{j}$ and $N+1$ instead of $N$. Hence the result by D4.

Let $M$ be a disjunction of $w Q$-predicates $(0<w<k)$ and $N_{M}$ be the sum of the $Q$ numbers of these $Q$-predicates in $e_{N}$. Hence $w$ is the logical width of $M$ ([Prob.] §32). Let $h_{M}$ be a full sentence of $M$ for a new individual.

T5. $c\left(h_{m}, e_{N}\right)=\frac{N_{M}+w}{N+k}$.(From T4 and A3.)
Consider a sequence of samples of increasing size $N$ but such that $r=N_{m} / N$ remains constant. Then the value of $c^{*}\left(h_{m}, e_{N}\right)$ moves from $w / k$ (for $N=0$, i.e., tautological evidence) towards $r$ (which is the limit for $N \rightarrow \infty$ ).

For further explanations and theorems on $c^{*}$ see [Prob.] § 110.

## XI. Further Axioms of Invariance (A8-A11)

A8. $\quad c(h, e)$ is invariant with respect to any permutation of the predicates of any family.

T1. Let $F$ be a family of $k$ primitive predicates ' $P_{1}$ ', ..., ' $P_{k}$ '. Let $h_{1}, \ldots, h_{k}$ be full sentences of these predicates with the same individual constant, and $h$ be the disjunction of these sentences.
a. (Lemma.) For any $e, c(h, e)=1$. (From A2, since $h$ is L-true.)
b. Suppose that $e^{\prime}$ does not contain any predicate of $F$. Then for any $i(=1, \ldots$, k), $c\left(h i, e^{\prime}\right)=1 / k$.

Proof. The $k$ values $c\left(h_{i}, e^{\prime}\right)$ are equal (by A8). Their sum $=c\left(h_{i}, e^{\prime}\right)($ by $\mathrm{A} 3)=1($ by (a)). Hence the assertion.
c. $m\left(h_{i}\right)=1 / k$. (From (b).)

A9. $c(h, e)$ is invariant with respect to any permutation of families of the same size.

A10. For non-general $h$ and $e, c(h, e)$ is independent of the total number of individuals. (A10 corresponds to the requirement of a fitting $c$-sequence, [Prob.] § 57C.)

A11. $c(h, e)$ is independent of the existence of other families than those occurring in $h$ or $e$.
XII. Learning from experience (A12)

The intuitive principle of learning from experience says that, other things being equal, the more frequently a kind of event has been observed, the more probable is its occurrence in the future. This is expressed more exactly in the axiom of instantial relevance (first proposed in Carnap [16])

A12. Suppose that $e$ is non-L-false and non-general, and $i$ and $h$ are full sentences of the same factual, molecular predicate ' $M$ ' with distinct individual constants not occurring in $e$.
a. $c(h, e . i)<\mathrm{c}(\mathrm{h}, \mathrm{e}) .{ }^{*} *$ THE ' $<$ ' SYMBOL SHOULD HAVE A VERTICAL LINE THRU IT**
b. $c(h, e . i) \neq c(h, e)$.

Both $\mathrm{c}^{\dagger}(\mathrm{X})$ and the straight rule (VI) fulfill part (a) of A12, but violate part (b). With $\mathrm{c}^{\dagger}, i$ is always irrelevant for $h$. With the straight rule, $i$ is irrelevant for $h$ if $e$ is a conjunction of full sentences of ' $M$ '; in this case both $c$-values are 1 .

T1. Let $e, i, h$, and $M$ be as in A12.
a. $c(h, e \cdot i)>c(h, e) ; i$ is positively relevant for $h$ on $e$.
b. Let $j$ be a conjunction of $n$ full sentences of ' $M$ ' $(n \geq 2)$ with $n$ distinct individual constants which do not occur in $e$ or $h$. Then

$$
c(h, e, j)>c(h, e) . \text { (From (a).) }
$$

c. $c(h, e . \sim i)<c(h, e) ; \sim i$ is negatively relevant for $h$ on e. (From (a) and [Prob.] T65-6e.)
d. $c(h, e, i)>c(h, e \cdot \sim i)$. (From (a), (c).)
XIII. The language $L_{F}$ with one family $F(\mathrm{Al} 3)$

This and the subsequent sections refer to a language $L_{F}$ whose primitive predicates are $k$ predicates ' $P_{1}$ ', .., ' $P_{k}$ ' of a family $F(\mathrm{k} \geq 2)$. A sentence
in $L_{F}$ may contain any number of individual constants but no variables. $e_{F}$ is an individual distribution for $s$ individuals with respect to $F$ with the cardinal numbers $s_{i}(i=1, \ldots, k) . h_{l, \ldots}, h_{k}$ are full sentences of ' $P_{1}$ ', $\ldots,{ }^{\prime} P_{k}$ ', respectively, with the same individual constant, which does not occur in $e_{F}$.

A13. Meaning postulates for $F$ :
a. $\mid h_{1} \vee h_{2} \vee \ldots \vee h_{k}$.
b. If $i \neq j, h_{i} . h_{j}$ is L-false.
$m\left(e_{F}\right)$ is independent of other individuals (A10) and other families (A11). It depends not on the particular individuals in $e_{F}$ but only on their numbers $s_{i}$. Therefore:

T1. For any $m$-function $m$ fulfilling the axioms, there is, for any $k$, a representative mathematical function $M_{k}$ of $k$ arguments such that, for any $e_{F}$,

$$
m\left(e_{F}\right)=M_{k}\left(s_{1}, s_{2}, \ldots, s_{k}\right) .
$$

T2. $\quad M_{k}$ is invariant with respect to any permutation of the $k$ arguments. (From A8.)
$e_{F} . h_{1}$ is an individual distribution for $s+1$ individuals with the cardinal numbers $s_{1}+1$, $s_{2}, \ldots, s_{k}$. We define:

D1. $\quad C_{k}\left(s_{1} ; s_{2}, \ldots, s_{k}\right)={ }_{\operatorname{Df}} \frac{M_{k}\left(s_{1}+1, s_{2}, \ldots, s_{k}\right)}{M_{k}\left(s_{1}, s_{2}, \ldots, s_{k}\right)}$.
T3. a. For any c -function $c$ and any $k$, there is a representative mathematical function $C_{k}$ of $k$ arguments such that, for any $e_{F}, c\left(h_{i}, e_{F}\right)=C_{k}\left(s_{1} ; s_{2}, \ldots, s_{k}\right)$. Analogously for $h_{2}$, etc.
b. $C_{k}$ is invariant with respect to any permutation of the $k-1$ arguments following the first.

I shall sometimes write ' $M$ ' and ' $C$ ' without subscripts.
T4. For any $k$ numbers $n, p, s_{3}, \ldots, s_{k}$ whose sum is $s$, the following holds. ('-_-, stands for ' $s_{3}, \ldots, s_{k}$ ' ; this expression drops out if $k=2$; in this case $n+p=s$.)

$$
\frac{C(n ; p+1,---)}{C(p ; n+1,---)}=\frac{C(n ; p,---)}{C 9 p ; n,---)}
$$

$$
(\text { Here } p+n+1+--=s+1 .)
$$

Proof. The following holds identically:

$$
\frac{M(n+1, p+1,---)}{M(n, p+1,---)} \times \frac{M(n, p+1,---)}{M(n, p,---)}=\frac{M(n+1, p+1,---)}{M(n+1, p,---)} \times \frac{M(n+1, p,---)}{M(n, p,---)}
$$

According to D 1 , the first quotient is $C(n ; p+1,--)$; the second is (by T2) equal to

$$
\frac{M(p+1, n,---)}{M(p, n,---)}=C(p ; n,---)
$$

the third becomes (again with reordering of arguments) $C(p ; n+1,---$ ), and the fourth $C(n ; p,--)$. Hence the theorem.

T5.
a. $\quad \sum_{i=1}^{k} c\left(h_{i}, e_{F}\right)=1 . \quad$ (From A13a.)
b. $\quad \sum_{i=1}^{k} C\left(s_{i} ; s_{1}, \ldots, s_{i-1}, s_{i+1}, \ldots, s_{k}\right)=1$. (From (a).)
XIV. The Axiom of Predictive Irrelevance (A14)

Let $e_{1}$ be formed from $e_{F}$ by replacing each predicate except ' $P_{1}$ ' with ' $\sim P_{1}$ '. Hence $e_{1}$ is an individual distribution for the $s$ individuals with respect to the division $P_{1}, \sim P_{1}$, with the cardinal numbers $s_{1}$ and $s-s_{1} . e_{2}, \ldots, e_{k}$ are formed analogously.

For given $k, c\left(h_{1}, e_{1}\right)$ depends only on $s_{1}$ and $s$. It can therefore be represented by a function $G_{k}\left(s_{1} ; s\right)$. Analogously for $i=2, \ldots, k$ (by A8).

T1. For any $c$-function $c$ and any $k$, there is a representative mathematical function $G_{k}$ such that, for $i=1, \ldots, k$.

$$
c\left(h_{i}, e_{i}\right)=G_{k}\left(s_{i} ; s\right) .
$$

T2. Suppose that $s_{1}<s$. Let $e^{\prime}{ }_{1}$ be like $e_{1}$ but with the cardinal numbers $s_{1}+1$ and $s-s_{1}-1$.
a. $c\left(h_{1}, e^{\prime}{ }_{1}\right)>c\left(h_{1}, e_{1}\right)$. (From XII-Tld.)
b. $G_{k}\left(s_{1}+1 ; s\right)>G_{k}\left(s_{1} ; s\right)($ From (a).)

The axiom of predictive irrelevance says that of the $k$ cardinal numbers in $e_{F}$ all except $s_{1}$ are irrelevant for $h_{1}$

A14. For $k>2, c\left(h_{1}, e_{F}\right)=c\left(h_{1}, e_{1}\right)$.
This axiom is not a necessary condition for the adequacy of $c$. But it is a customary (usually tacit) assumption, and it leads to a great simplification of the system. If $k=2$, then $e_{1}$ is the same as $e_{F}$ and therefore A14 is fulfilled trivially.

T3. For any $k(\geq 2)$ any any $i$ :
a. $c\left(h_{i}, e_{F}\right)=c\left(h_{i}, e_{i}\right)$. (From A14, A8.)
b. For any numbers $s_{2}, \ldots, s_{k}$ whose sum is $s-s_{i}, C_{k}\left(s_{1} ; s_{2}, \ldots, s_{k}\right)=G_{k}\left(s_{1} ; s\right)$. (From (a).)

I shall often write ' $G$ ' for ' $G_{k}$ '.
T4. For any sequence of $k$ numbers $s_{1}, \ldots, s_{k}$ whose sum is $s$,

$$
\sum_{i=1}^{k} G\left(s_{i} ; s\right)=1 . \text { (From XIII-T5.) }
$$

Special cases of T4:
T5. a. $G(s ; s)+(k-1) G(0 ; s)=1$. (From T4 for the sequence $s, 0, \ldots, 0$.)
b. $G(s+1 ; s+1)=1-(k-1) G(0 ; s+1)$. (From (a).)
c. $G(1 ; 1)=1-(k-1) G(0 ; 1)$. (From (a).)
d. $G(s ; s+1)+G(1 ; s+1)+(k-2) G(0 ; s+1)=1$. (Sequence $s, 1,0, \ldots, 0$.

The following development has the aim to show (1) that, if all values of $G$ for $s$ are given, the values for $s+1$ are uniquely determined, and (2) if $G(0 ; 1)$ is given, all values of $G$ are uniquely determined. For these results it is presupposed that $k>2$.

T6. For $k>2$; for any $n, p, s$ such that $n+p \leq s$.
a. $\frac{G(n ; s+1)}{G(p ; s+1)}=\frac{G(n ; s)}{G(p ; s)}$. (From XIII-T4.)
b. $G(n ; s+1)=G(0 ; s+1) \frac{G(n ; s)}{G(0 ; s)}($ From (a) with $p=0$.$) .$

T7. For $k>2$.

$$
G(0 ; s+1)\left[\frac{G(s ; s)}{G(0 ; s)}+\frac{G(1 ; s)}{G(0 ; s)}+k-2\right]=1
$$

(From T5d, by transforming the first two of its $G$-terms according to T 6 b .)
Now aim (1) has been reached. If all $G$-values for $s$ are given, $G(0 ; s+1)$ is determined by T7, then the values $G(n ; s+1)$ for $n=1, \ldots, s$ are determined by T6b, and $G(s+1 ; s+1)$ by T5b. Thus all values for $s+1$ are determined.

We have also attained aim (2). If $G(0 ; 1)$ is given, $G(1 ; 1)$ is determined by T5c. These are all the $G$-values for $s=1$. They determine the values for $s=2$, and so on. Thus all $G$-values are determined by $G(0 ; 1)$. The following theorem gives the explicit form.

T8. For $k>2$, for any $s$ and $n(0 \leq n \leq s)$,
$G(n ; s)=\frac{n-(k n-1) G(0 ; 1)}{s-(s-1) k G(0 ; 1)}$.
(This can be proved by mathematical induction with respect to s. (1) The theorem holds for $s=1$ (for $n=0$ it holds identically, for $n=1$ by T5c). (2) If the theorem holds for a given $s$, it holds likewise for $s+1$; this can be shown with the help of the theorems T7, T6b, and T5b, which determine the $G$-values for $s+1$ on the basis of those for $s$. Hence the theorem holds for every $s$.)

Suppose that the value of $G(0 ; 1)$ has been chosen. Then all values of $G$ can be determined. The following theorem T9 shows that the $m$-value of any state-description is determined by the value of $G$. Thereby the $m$-values for all sentences and the $c$-values for all pairs of sentences are determined (see VI).

T9. Let $Z_{F}$ be a state-description for $N$ individuals and for the $k$ predicates of the family $F$, with the cardinal numbers $N_{i}(i=1, \ldots, k)$. Then

$$
m\left(Z_{F}\right)=\prod_{i} \prod_{n=0}^{N_{i}-1} G\left(n ; S_{i}+n\right)
$$

where $\prod_{i}$ runs through those values of $i$ for which $N_{i}>0$;
$S_{i}=\sum_{h=1}^{i-1} N_{h}, S_{1}=0 . \quad$ (For the proof see [Continuum] § 5.)
XV. The $\lambda$-system (Al 5)

We shall construct a system of all $c$-functions fulfilling our axioms. We call it the $\lambda$-system, because the $c$-functions will be characterized by the values of a parameter $\lambda$.

We have seen that, for a given $k(>2)$, all values of $G$ are determined by $G(0 ; 1)$. The latter value can be freely chosen within certain boundaries. We shall now determine these boundaries.

From XI-T1c:
(1) $c\left(h_{i}, t\right)=1 / k$.

Hence with XII-T1c (based on A12):
(2) $G(0 ; 1)<1 / k$.

If we were to choose $G(0 ; 1)>1 / k$, then $c$ would violate not only A12b but also A12a and therefore be unacceptable. If we choose $G(0 ; 1)=1 / k$, then only A12b is violated. This $c$ does not belong to the $\lambda$-system, but will nevertheless be discussed as a boundary case (we shall find that it is the same as $c^{\dagger}$ in X ).

The following is obvious (from Al):
(3) $\quad G(0 ; 1) \geq 0$.

If we choose $G(0 ; 1)=0$, then the resulting $c$ fulfills A1 to A5, but violates A6. Hence it is quasi-regular. Therefore it does not belong to the $\lambda$-system. It will, however, be discussed as a boundary case; we shall see that it corresponds to the straight rule.

T1. $0<G(0 ; 1)<1 / k$.
It can also be shown that, if any value between 0 and $1 / k$ is chosen for $G(0 ; 1)$, then the resulting $c$-function fulfills our axioms.

We define first an auxiliary parameter:
D1. $\quad \lambda_{k}^{\prime \prime \prime}={ }_{\mathrm{Df}} k G_{k}(0 ; 1)$.

From T1:

T2. $0<\lambda_{k}^{\prime \prime \prime}<1$.

I shall usually write ' $\lambda$ '"' for ‘ $\lambda_{k}^{\prime \prime \prime}$ '. From XIV-T8:

T3. For $k>2$, for any $s$ and $n(0 \leq n \leq s)$.

$$
G(n ; s)=\frac{n-(n-1 / k) \lambda^{\prime \prime \prime}}{s-(s-1) \lambda^{\prime \prime \prime}}
$$

We shall mostly use, not $\lambda^{\prime \prime \prime}$, but $\lambda=\lambda^{\prime \prime \prime} /\left(1-\lambda^{\prime \prime \prime}\right)$. The use of $\lambda$ leads to a simpler formula for $G(n ; s)(\mathrm{T} 4 \mathrm{c})$. However, in the case of $G(0 ; 1)=1 / k, \lambda^{\prime \prime \prime}=1$, while $\lambda$ is infinite. Therefore in this case $\lambda$ is less convenient than $\lambda^{\prime \prime \prime}$. But this case is not included in our system.

D2. $\quad \lambda_{k}=\operatorname{Df} \frac{k G_{k}(0 ; 1)}{1-k G_{k}(0 ; 1)}$.
T4. a. $\lambda^{\prime \prime \prime}=\lambda /(\lambda+1)$.
b. $G(0 ; 1)=\frac{\lambda}{k(\lambda+1)}$.
c. For $k>2, G(n ; s)=\frac{n+\lambda / k}{s+\lambda}$. (From T3, (a).)

The case $k=2$. The important results at the end of XIV can be proved only if $k>2$. (This seems surprising, since A14, on which the results are based, holds also for $k=2$.) A new axiom must be added for $k=2$. T4c shows that, for given $k(>2), s$, and $G(0 ; 1), G(n ; s)$ is a linear function of $n$. We assume as an axiom that the same holds for $k=2$ :

A15. For given $s$ and $G_{2}(0 ; 1), G(n ; s)$ is a linear function of $n$.
Note that $G_{2}(n ; s)=C_{2}(n ; s-n)$ (see XVI-T3b). Therefore we have (without use of A15):

$$
\begin{align*}
& G_{2}(n ; s)+G(s-n ; s)=1 . \text { (From XIII-T5b.) }  \tag{4}\\
& \frac{G_{2}(n ; s+1)}{G_{2}(s-n ; s+1)}=\frac{G_{2}(n ; s)}{G_{2}(s-n ; s)} .(\text { From XIII-T4.) }
\end{align*}
$$

From (4) and (5) we can derive with A15:
T5. $\quad G_{2}(n ; s+1)=G_{2}(0 ; s+1) \frac{G_{2}(n ; s)}{G_{2}(0 ; s)}$.

This corresponds to XIV-T6b. Then, in analogy to the earlier proofs, we can now prove the analogues of T 3 and of T 4 c for $k=2$; the latter is

T6. $\quad G_{2}(n ; s)=\frac{n+\lambda / 2}{s+\lambda}$.
For any $\lambda$, let $c_{\lambda}$ be the $c$-function characterized by $\lambda$, and $m_{\lambda}$ be the corresponding $m$ function. Using our result for $G(n ; s)(\mathrm{T} 4 \mathrm{c}, \mathrm{T} 6)$, we obtain T7a from XIV-T9 (for the proofs of T7b and c and the notation $\left[\begin{array}{l}r \\ n\end{array}\right]$, see [Continuum] § 10).

T7.

> a. $m_{\lambda}\left(Z_{F}\right)=\prod_{\substack{i}} \prod_{n=0}^{N_{i}-1} \frac{n+\lambda / k}{S_{i}+n+\lambda}=$
> b. $\quad=\frac{\prod_{i}\left[\left(\frac{\lambda}{k}\right)\left(\frac{\lambda}{k}+1\right)\left(\frac{\lambda}{k}+2\right) \ldots\left(\frac{\lambda}{k}+N_{i}-1\right)\right]}{\lambda(\lambda+1)(\lambda+2) \ldots(\lambda+N-1)}$
> c. $\quad=\frac{\prod_{i}\left[\begin{array}{c}N_{i}+\lambda / k-1 \\ N_{i}\end{array}\right]}{\left[\begin{array}{c}N_{i}+\lambda-1 \\ N\end{array}\right]}$.
d. Let $\operatorname{Str}_{F}$ be the structure-description corresponding to $Z_{F}$. Then

$$
m_{\lambda}\left(\operatorname{Str}_{F}\right)=\frac{\prod_{i}\left[\begin{array}{c}
N_{i}+\lambda / k-1 \\
N_{i}
\end{array}\right]}{\left[\begin{array}{c}
N_{i}+\lambda-1 \\
N
\end{array}\right]}
$$

(From (c) with VIII-T3.)

## XVI. Various c-Functions in the $\lambda$-System

Let the predicate ' $M$ ' be defined as a disjunction of $w$ predicates of $F: P_{1} \vee P_{2} \vee \ldots \vee P_{w}$. Hence its logical width is $w$. Let $e_{F}$ be as before, and $h_{M}$ a full sentence of ' $M$ ' for a new individual. Let $e_{M}$ be $s_{1}+s_{2}+\ldots+s_{w}$. Then we have (from XV):

$$
\begin{equation*}
c_{\lambda}\left(h_{M}, e_{F}\right)=\frac{s_{M}+w \lambda / k}{s+\lambda} . \tag{1}
\end{equation*}
$$

This is

$$
\frac{\frac{s_{M}}{s} s+\frac{w}{k} \lambda}{s+\lambda}
$$

thus it is the weighted mean of the observed relative frequency $s_{M} / s$ and the relative width $w / k$, with weights $s$ and $\lambda$, respectively. $s_{M} / s$ is an empirical factor in the situation, and $w / k$ is a logical factor. $\lambda$ is thus the weight of the logical factor. The greater the chosen $\lambda$, the closer to $w / k$ is the above $c$-value.

Example. For an even $k$, we take a predicate ' $M$ ' with $w=k / 2$. In $e_{F}$, let $s=10, s_{M}=1$. Then the $c_{\lambda}$-value in (1), for various choices of $\lambda$, is as follows (see [Continuum] (12-19)):

| $\lambda$ | $=$ | 1 | 2 | 4 | 8 | 16 | 32 | $\infty$ |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| $c_{\lambda}\left(h_{M}, e_{F}\right)=$ | 0.1 | 0.136 | 0.167 | 0.214 | 0.278 | 0.346 | 0.405 | 0.5 |

For $\lambda=0, c=s_{M} / s$. This is the straight rule, which violates A6. ([Continuum] § 14.)
For $\lambda=\infty, c=w / k=c\left(h_{M}, t\right)$. This is $c^{\dagger}$, which violates A 12b. ([Continuum] § 13.)
These are the two extreme methods, not included in the $\lambda$-system. In this system, we take $0<\lambda<\infty$; hence the above $c$ is between $s_{M} / s$ and $w / k$ (if these are unequal).

For families of different sizes (each in a separate language) we distinguish two kinds of inductive methods.

Inductive methods of the first kind: a fixed value is chosen for $\lambda$, independent of $k$. ([Continuum] § 11.)

Inductive methods of the second kind: $\lambda_{k}$ is dependent upon $k$. The simplest form is: $\lambda_{k}=$ $C_{k}$, with a constant $C$. The simplest method of this form takes $C=1$, hence $\lambda_{k}=k$; thus from (1):
(2) $\quad c_{\lambda}\left(h_{M}, e_{F}\right)=\frac{s_{M}+w}{s+k}$.

This is the function $c^{*}($ see X$)$.
XVII. A Language with Two Families (A16)

The language L contains two families: $F^{1}$ consists of $k_{1}$ predicates: ' $P_{1}^{1}$ ' ' $P_{2}^{1}$ ', etc; and $F^{2}$ of $k_{2}$ predicates: $P_{1}^{2}$ ' $P_{2}^{2}$ ' etc. There are
$k=k_{1} k_{2} Q$-predicates; $Q_{i j}$ is the conjunction $P_{i}{ }^{1} . P_{j}{ }^{2}\left(i=1, \ldots, k_{1}: j=1, \ldots, k_{2}\right)$.
Let $e^{1}$ be an individual distribution for $F^{1}$, and $e^{2}$ for $F^{2}$, both for the same $s$ individuals. Let $e$ be $e^{1} . e^{2}$. This is an individual distribution for the $k Q$-predicates; let $s_{i j}$ be the number of individuals with $Q i j$.

We take the same $\lambda$ for both families. Then we can determine $m_{\lambda}\left(e^{1}\right)$ and $m_{\lambda}\left(e^{2}\right)$ (by XVT7).

Problem: What is to be taken as value of $m_{\lambda}(e)$ ? This is not determined by the previous axioms. We shall now consider two attempts at a solution, and then take a combination of them.

First tentative solution. We take the class of the $k Q$-predicates as the pseudo-family $F^{1,2}$. Then we define $m^{1,2}$ for $F^{1,2}$, as if the latter were a real family; hence, in analogy to XV-T7c

D1.

$$
m_{\lambda}^{1,2}(\mathrm{e})=\operatorname{Df} \frac{\prod_{i=1}^{k_{1}} \prod_{j=1}^{k_{2}}\left[\begin{array}{c}
s_{i j}+\frac{\lambda}{k}-1 \\
s_{i j}
\end{array}\right]}{\left[\begin{array}{c}
s+\lambda-1 \\
s
\end{array}\right]}
$$

$m_{i}^{1,2}\left(\right.$ e) depends only on the $Q$-numbers $s_{i j}$ in $e$, not on the $P$-numbers in $e^{1}$ or $e^{2}$.
Second tentative solution. We define $m^{1 / 2}(e)$ as the product of the $m$-values for the two families separately:

D2. $\quad m_{\lambda}^{1 / 2}(e)={ }_{\mathrm{Df}}=m_{\lambda}\left(e^{1}\right) \times m_{\lambda}\left(e^{2}\right)$.
$m^{1 / 2}(e)$ depends only on the $P$ - numbers, not on the $Q$-numbers.
We shall examine the two solutions with the help of the following three examples $A, B$, $C$, of individual distributions for $s=20$ individuals, with $k_{1}=k_{2}=2$ (the numerals in the four cells indicate the $Q$-numbers; the marginal numerals indicate the $P$-numbers for the two families).

|  |  | $A$ |  | $F^{2}$ |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | $P_{1}{ }^{2}$ | $P_{2}{ }^{2}$ |  |  |
|  |  |  |  |  |  |
| $F^{1}$ | $P_{1}{ }^{1}$ | 10 | 5 | 5 |  |
|  |  | $P_{2}{ }^{1}$ | 10 | 5 |  |


| $B$ | $F^{2}$ |  |
| :---: | :---: | :---: |
|  | $P_{1}{ }^{2}$ | $P_{2}{ }^{2}$ |
|  | 10 | 10 |
| 10 | 10 | 0 |
| 10 | 0 | 10 |


| $C$ | $F^{2}$ |  |
| :---: | :---: | :---: |
|  | $P_{1}{ }^{2}$ | $P_{2}{ }^{2}$ |
|  | 10 | 10 |
| 20 | 10 | 10 |
| 0 | 0 | 0 |

The following two requirements (or desiderata) I and II seem plausible.
(I) We should have: $m(A)<m(B)$, because $B$ is more uniform than $A$.

This requirement is satisfied by $m^{1,2}$ (because the $Q$-numbers are equal in $A$, unequal in $B$ ), but not by $m^{1 / 2}$ (this has equal values for $A$ and for $B$, because the $P$-numbers are the same).
(II) We should have: $m(B)<m(C)$ because the distribution for $F^{1}$ is more uniform in $C$ than in $B$, while that for $F^{2}$ is the same in $C$ as in $B$.

This requirement is in accord with the customary analogy inference ('horse-donkey inference'). However, it is not satisfied by $m^{1,2}$ (this has equal values for $B$ and for $C$, because the $Q$-numbers are the same). It is satisfied by $m^{1 / 2}$.

Thus both solutions are unsatisfactory. Generally, any solution that uses only the $P$ numbers cannot satisfy I, and any solution that uses only the $Q$-numbers cannot satisfy II. An adequate solution must use both the $P$-numbers and the $Q$-numbers. This is done in the third solution, which satisfies both requirements.

Third solution. We define $m_{\lambda, n}(e)$ as a weighted mean of the first two solutions, with the weights $\eta$ and $1-\eta$, where $\eta$ is a new parameter

D3. $\quad m_{\lambda, n}(e)={ }_{\operatorname{Df}} \eta m^{1 / 2}(e)+(1-\eta) m^{1 / 2}(e)$.
The parameter $\eta$ may be chosen, independently of $\lambda$, such that $0<\eta<1$. The greater $\eta$ is, the stronger is the influence by analogy (i.e., the greater is the difference between the two $c$ values in A16 below). The method can easily be extended to more than two families; no new parameter is needed. (The method was worked out in collaboration with John Kemeny.)

The requirement II can be represented in a generalized form as follows:
A16. Axiom of analogy. Let $e$ be an individual distribution for two families (with any $k_{1}$ and $k_{2}$ ). Let $i$ and $j$ be full sentences of $Q_{11}$ and $Q_{12}$, respectively, with the same individual constant not occurring in $e$. Let $h$ be a full sentence of $Q_{12}$ with another individual constant not occurring in $e$. Then

$$
c(h, e, i)>c(h, e, j) .
$$

The generalization for other $Q$-predicates follows by A8.
XVIII. An Infinite Domain of Individuals (A17)

Let the domain of $L_{N}$ contain $N$ individuals, and that of $L_{\infty}$ be denumerably infinite. According to A10, the values of $c$ for non-general sentences are in $L_{\infty}$ the same as in $L_{N}$. If either $e$ or $h$ or both contain variables, a new axiom is needed. We take the value of $c$ in $L_{\infty}$ as the limit of its values in finite languages (see [Prob.] § 56)

A17. Axiom of the infinite domain. Let $N_{N} c$ be a $c$-function for $L_{N}$. Then the corresponding $c$-function ${ }_{\infty} c$ for $L_{\infty}$ is determined as follows:
${ }_{\infty} c(h, e)=\lim _{\mathrm{N} \rightarrow \infty} c(h, e)$.

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