# Programming Techniques

R. M. McCLURE, Editor

## An Algorithm for the Probability of the Union of a Large Number of Events

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An algorithm is presented which efficiently evaluates the probability for the union of n independent and not mutually exclusive events. The problem is that of evaluating the sums of the products of all possible combinations of n variables in minimum time and storage space.

KEY WORDS AND PHRASES: algorithm, probability, optimum, storage vs. time compromise, set union, mutually exclusive events CR CATEGORIES: 5.12, 5.5, 5.6

### 1. Introduction

The probability of the union of n events,  $E_{\alpha}$  ( $\alpha = 1, 2, \dots, n$ ), [1] is

$$P\left(\bigcup_{\alpha=1}^{n} E_{\alpha}\right) = \sum_{\alpha=1}^{n} P(E_{\alpha})$$

$$-\sum_{\beta>\alpha=1}^{n} P(E_{\alpha} \cap E_{\beta}) + \cdots$$

$$+ (-1)^{n-1} P(E_{1} \cap \cdots \cap E_{n}).$$
(1)

If the n events are independent then

$$P\left(\bigcup_{\alpha=1}^{n} E_{\alpha}\right) = \sum_{\alpha=1}^{n} P(E_{\alpha})$$

$$-\sum_{\beta>\alpha=1}^{n} P(E_{\alpha})P(E_{\beta}) + \cdots$$

$$+ (-1)^{n-1}P(E_{1}) \cdots P(E_{n}).$$
(2)

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Denoting  $P(E_{\alpha})$  by  $P_{\alpha}$ , eq. (2) becomes

$$P\left(\bigcup_{\alpha=1}^{n} E_{\alpha}\right) = \sum_{\alpha=1}^{n} P_{\alpha} - \sum_{\beta>\alpha=1}^{n} P_{\alpha} P_{\beta}$$

$$+ \sum_{\gamma>\beta>\alpha=1}^{n} P_{\alpha} P_{\beta} P_{\gamma} + \dots + (-1)^{r-1}$$

$$\sum_{\gamma>\dots>\beta>\alpha=1}^{n} P_{\alpha} P_{\beta} \dots P_{\gamma} + \dots$$

$$+ (-1)^{n-1} P_{1} P_{2} \dots P_{n}.$$

$$(3)$$

For the large values of n the evaluation of eq. (3) in minimum time while using minimum storage space becomes a problem. To achieve minimum storage space it is necessary to determine each product in eq. (3) separately and add it to the sum. For the rth term this entails  $(r \times {}_{n}C_{r}) - 1$  operations and for  $P(\bigcup_{\alpha=1}^{n} E_{\alpha})$  a total of

$$2(n-1) + \sum_{r=2}^{n} [(r \times {}_{n}C_{r}) - 1]$$

operations. The time required would be prohibitive for large n.

On the other hand, by storing each of the  ${}_{n}C_{r}$  products in the rth term for use in evaluating the (r+1)-th term a minimum of  ${}_{n}C_{n/2}$  storage spaces would be required.

The algorithm presented here is an optimal compromise in that it is nonrepetitive in evaluating products while at the same time it requires only 3n storage spaces in evaluating  $P(\bigcup_{\alpha=1}^n E_{\alpha})$ .

#### 2. Procedure

If we define  $T_r$  to be the rth term in eq. (3), then

$$P\left(\bigcup_{\alpha=1}^{n} E_{\alpha}\right) = \sum_{r=1}^{n} T_{r}. \tag{4}$$

Each  $T_r$  is the sum of  ${}_{n}C_r$  products which may be subdivided into (n-r+1) partial sums  $S_{ri}$ . Hence

$$T_r = (-1)^{r-1} \sum_{i=1}^{n-r+1} S_{ri}.$$
 (5)

Each set of partial sums  $S_{ri}$  ( $i = 1, 2, \dots, n - r + 1$ ) may be determined from the previous set  $\{S_{r-1}, i\}$  as follows:

$$S_{ri} = \sum_{j=i+1}^{n-r+1} P_i S_{r-1,j} .$$
(6)

Taking the first set of  $S_{1i}$   $(i = 1, 2, \dots, n)$  to be  $S_{11} = p_1$ ,  $S_{12} = p_2, \dots, S_{1n} = p_n$ , the probability  $P(\bigcup_{\alpha=1}^n E_\alpha)$  may

		****	_
	FUNCTION PRUN(N, PROB)	UNION	
	DIMENSION PROB(50), PSUM(50), TERM(50)	UNION	2
С	PROGRAM TO DETERMINE THE PROBABILITY OF THE		
•	UNION OF	UNION	3
С	N(MAXIMUM 50) INDEPENDENT, BUT NOT MUTUALLY		-
U	R(MAXIMUM 50) INDEPENDENT, BOT NOT HOTORDET  EXCLUSIVE EVENTS	UNION	3.
	PYCTORIAE FARMIS		
С		UNION	
C	PRUN=PROBABILITY OF THE UNION	UNION	
C	N=NUMBER OF EVENTS INCLUDED	UNION	7
C	PROB(I)=PROBABILITY OF THE I-TH EVENT	UNION	8
č	TERM(R)=R-TH TERM IN THE N-TERM EXPRESSION		
•	FOR PRUN	UNION	Q
	PSUM(I)=I-TH OF (N-R+1) PARTIAL SUMS IN TERM(R)	UNION	
C	PSOW(I)=I=IH OF (N=K+1) PARTIAL SOME IN LEGAL(X)		
С		UNION	
С	INITIALIZATION OF VARIABLES	UNION	
	DO1J=1.N	UNION	13
	PSUM(J)=O.O	UNION	14
	TERM(J)=0.0	UNION	15
		UNION	
	TERM(N)=1.0	UNION	
	PRUN=0.0		
С		UNION	
С	EVALUATION OF PARTIAL SUMS AND TERMS OF PRUN	UNION	
	DO2J=1.N	UNION	20
	TERM(1)=TERM(1)+PROB(J)	UNION	21
	TERM(N)=TERM(N)*PROB(J)	UNION	22
	PSUM(J)=PROB(J)	UNION	
•		UNION	
	IF(N-2)7,7,6		
C	EVALUATION OF MIDDLE (N-2) TERMS OF PRUN	UNION	
	5 I2=N <b>-1</b>	UNION	
	J2=N	UNION	27
	D04I=2,I2	UNION	28
	J2=J2=1	UNION	29
	K2=J2+1	UNION	
		UNION	
	D04J=1,J2		
	PSUM(J)=0.0	UNION	
	K1=J+1	UNION	
	DO3K=K1,K2	UNION	34
	3 PSUM(J)=PSUM(J)+PROB(J)*PSUM(K)	UNION	35
	4 TERM(I)=TERM(I)+PSUM(J)	UNION	
c	+ 15WW(1)=15WW(1)+150W(0)	UNION	
	WHAT TOY OF A MUDDIO OF DRUN	UNION	
C	SUMMATION OF N TERMS OF PRUN		
	7 SIGN=-1.0	UNION	
	DO5J=1,N	UNION	
	SIGN=-SIGN	UNION	
	5 PRUN=PRUN+SIGN*TERM(J)	UNION	42
	RETURN	UNION	43
	END	UNION	
	Dit D		,

Fig. 1

be determined; i.e.

$$P\left(\bigcup_{\alpha=1}^{n} E_{\alpha}\right) = \sum_{i=1}^{n} P_{i} + \sum_{r=2}^{n} (-1)^{r-1} \sum_{i=1}^{n-r+1} \sum_{j=i+1}^{n-r+1} P_{i} S_{r-1,j}.$$
 (7)

The number of arithmetic operations is reduced in (7) to N = 2(n-1)

$$+\sum_{r=2}^{n} \left\{ \left[ \sum_{i=1}^{n-r+1} 2(n-r+1) + 1 \right] + (n-r) \right\};$$
 (8)

i.e.

$$N = 2(n-1) + \sum_{r=2}^{n} [(n-r+1)^{2} + (n-r)]. \quad (9)$$

For n as small as 10 the savings in time and storage space are considerable. For the minimum storage condition 6898 arithmetic operations are required at n=10. By using the algorithm presented here, this can be reduced to 339 operations. At the same time the required storage space is reduced from 252 locations under the minimum time condition to 30 here.

Figure 1 shows a listing of the algorithm coded as a FORTRAN FUNCTION SUBPROGRAM.

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#### REFERENCE

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J. G. HERRIOT, Editor

ALGORITHM 336 NETFLOW [H]

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(Recd. 2 Oct. 1967 and 20 May 1968)

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KEY WORDS AND PHRASES: capacitated network, linear programming, minimum-cost flow, network flow, out-of-kilter CR CATEGORIES: 5.32, 5.41

procedure NETFLOW (nodes, arcs, I, J, cost, hi, lo, flow, pi,
 INFEAS);

value nodes, arcs; integer nodes, arcs;

integer array I, J, cost, hi, lo, flow, pi; label INFEAS;

**comment** This procedure determines the least-cost flow over an upper and lower bound capacitated flow network.

Each directed network arc a is defined by nodes I[a] and J[a], has upper and lower flow bounds hi[a] and lo[a], and cost per unit of flow cost[a]. Costs and flow bounds may be any positive or negative integers. An upper flow bound must be greater than or equal to its corresponding lower flow bound for a feasible solution to exist. There may be any number of parallel arcs connecting any two nodes.

The procedure returns vectors flow and pi. flow[a] is the computed optimal flow over network arc a. pi[n] is a number—the dual variable—which represents the relative value of injecting one unit of flow into the network of node n. NETFLOW may be entered with any values in vectors flow and pi (such as those from a previous or a guessed solution) feasible or not. If the initial contents of flow do not conserve flow at any node, the solution values will also not conserve flow at that node, by the same amount.

This procedure is a revision (see remark by T. A. Bray and C. Witzgall [1]) of Algorithm 248 [2]. Like the original, it follows the out-of-kilter algorithm described by D. R. Fulkerson [3] and elsewhere. It follows the RAND code by R. J. Clasen (Fortran) in three instances, using a single set of labels na, which correspond to the nb of Algorithm 248, avoiding superfluous tests in the part following BACK (for instance,  $c > 0 \land flow[a] < lo[a]$  is equivalent to c > 0 at this point of the program), and taking advantage of the fact that arcs remain in kilter and need not be rechecked again. In addition, the convention inf = -1 is adopted in order to permit costs and bounds of value around 99999999 without their interfering with the initiation of minimum search.

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