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# Expected Normal Order Statistics (Exact and Approximate)

### By J. P. ROYSTON

MRC Clinical Research Centre, Harrow HA13UJ, Middx, UK

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#### LANGUAGE

Fortran 66

### DESCRIPTION AND PURPOSE

The algorithms NSCOR1 and NSCOR2 calculate the expected values of normal order statistics in exact or approximate form respectively. NSCOR2 requires little storage and is fast, and hence is suitable for implementation on small computers or certain programmable calculators (HP-67, etc). This is not recommended for NSCOR1. Expected normal order statistics are needed in the calculation of analysis of variance tests of normality, such as W (Shapiro and Wilk, 1965) and W' (Shapiro and Francia, 1972).

In a sample of size n the expected value of the rth largest order statistic is given by

$$E(r,n) = \frac{n!}{(r-1)! (n-r)!} \int_{-\infty}^{\infty} x \{1 - \Phi(x)\}^{r-1} \{\Phi(x)\}^{n-r} \phi(x) \, dx,\tag{1}$$

where  $\phi(x) = 1/\sqrt{(2\pi)} \exp(-\frac{1}{2}x^2)$  and  $\Phi(x) = \int_{-\infty}^{x} \phi(z) dz$ .

Values of E(r, n) accurate to five decimal places were obtained by Harter (1961) using numerical integration, for n = 2(1) 100(25) 250(50) 400. Subroutine NSCOR1 uses the same technique as Harter (1961). Rewrite the integrand in (1) as

 $I(r, n, x) = t_0(x) \exp\{\log_e n! - \log_e (n-r)! - \log_e (r-1)! + (r-1)t_1(x) + (n-r)t_2(x) + t_3(x)\},$ 

where

$$t_0(x) = x, \quad t_1(x) = \log_e \{1 - \Phi(x)\}, \quad t_2(x) = \log_e \Phi(x), \quad t_3 = -\frac{1}{2} \{\log_e (2\pi) + x^2\}.$$

Values of  $t_0$ ,  $t_1$ ,  $t_2$  and  $t_3$  are calculated in the range  $x = -9 \cdot 0(h)9 \cdot 0$ , using the auxiliary subroutine *INIT*, which needs to be called once only. E(r, n) is obtained by summing the values of I(r, n, x) and multiplying the result by h. We found h = 0.025 sufficiently small. Values of  $\Phi(x)$  must be supplied by a suitable algorithm, such as AS 66 (Hill, 1973). Log factorials are obtained from the auxiliary function ALNFAC, kindly supplied by Dr I. D. Hill. This is a modification of Pike and Hill's (1966) algorithm.

An approximation to E(r, n) for n = 2(1)50 with accuracy 0.001 was given in AS 118 (Westcott, 1977). Using a different numerical method, NSCOR2 extends the range of n to 2000 and greatly improves the accuracy. Blom (1958) proposed the approximate formula

$$E(r,n) = -\Phi^{-1}\left(\frac{r-\alpha}{n-2\alpha+1}\right)$$

and recommended the compromise value  $\alpha = 0.375$ . Harter (1961) provided values for  $\alpha$  as functions of r and n, improving the overall accuracy to about 0.002 for  $n \leq 400$ . Defining

$$P_{r,n} = \Phi\{-E(r,n)\}$$
 and  $Q_{r,n} = \frac{r-\varepsilon}{n+\gamma}$ ,

we approximate  $P_{r,n}$ , the normal upper tail area corresponding to E(r, n), as © 1982 Royal Statistical Society 0035-9254/82/31161 \$2.00

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$$\tilde{P}_{r,n} = Q_{r,n} + \frac{\delta_1}{n} Q_{r,n}^{\lambda} + \frac{\delta_2}{n} Q_{r,n}^{2\lambda} - C_{r,n}.$$

Estimates of  $\varepsilon$ ,  $\gamma$ ,  $\delta_1$ ,  $\delta_2$  and  $\lambda$  were obtained for r = 1, 2, 3 and  $r \ge 4$ , and  $\lambda$  was further approximated as  $\lambda = a + b/(r+c)$  for  $r \ge 4$ . A small correction  $C_{r,n}$  to  $\tilde{P}_{r,n}$  was found necessary for  $r \le 7$  and  $n \le 20$ , and this is supplied by the auxiliary function *CORREC*. The approximation to E(r, n) is thus given by

$$\widetilde{E}(r,n) = -\Phi^{-1}(\widetilde{P}_{r,n}).$$

Values of the inverse normal probability function  $\Phi^{-1}$  may be obtained from Algorithm AS 111 (Beasley and Springer, 1977).

Note that both NSCOR1 and NSCOR2 generate the  $\lfloor n/2 \rfloor$  largest rankits; the (symmetrical) smallest rankits are obtained via

$$E(n-r+1, n) = -E(r, n), r = 1, ..., [n/2],$$

with E([n/2] + 1, n) = 0 if *n* is odd.

STRUCTURE

# SUBROUTINE NSCOR1 (S, N, N2, WORK, IFAULT)

Formal parameters

S	Real array (N2)	output: contains N2 largest rankits
N	Integer	input: sample size
N2	Integer	input: largest integer less than or equal to $\frac{1}{2}N$
WORK	Real array (4,721)	input: working array, values set by INIT
IFAULT	Integer	output: fault indicator, equal to
	-	3 if $N2 \neq N/2$
		2 if $N > 2000$

2 if 
$$N > 2000$$

1 if 
$$N \leq 1$$

0 otherwise

# SUBROUTINE INIT (WORK)

Formal parameters

WORK Real array (4,721) output: working array required by NSCOR1

The user must call INIT once before the first call of NSCOR1.

REAL FUNCTION ALNFAC (J) calculates natural log of factorial J; it is called from within NSCOR1.

SUBROUTINE NSCOR2 (S, N, N2, IFAULT)

Formal parameters Identical to NSCOR1, except that a working array (WORK) is not required. REAL FUNCTION CORREC (I, N) is called from within NSCOR2.

# Failure indications

The fault condition IFAULT = 2, occurring if N > 2000, still permits the calculation of rankits, but the results cannot be guaranteed to be as accurate as for lower values of N. No calculations are carried out when IFAULT = 1 or 3.

# Auxiliary algorithms

*REAL FUNCTION ALNORM (X, UPPER)* calculates the upper or lower tail area under the normal distribution at *X*, e.g. Algorithm AS 66 (Hill, 1973).

*REAL FUNCTION PPND (P)* calculates the normal equivalent deviate corresponding to *P*, e.g. Algorithm AS 111 (Beasley and Springer, 1977).

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### RESTRICTIONS

NSCOR1 and NSCOR2 have been validated up to N = 2000, but NSCOR2 is probably accurate for much larger N. The accuracy of NSCOR1 for N > 2000 may be improved by reducing the constant h (and increasing NSTEP).

### PRECISION

The algorithms were developed on a 48-bit machine (ICL 1903A). NSCOR1 requires DOUBLE PRECISION on machines of word-length 36 bits or fewer. The following changes should be made to construct a double precision version:

1. INIT, NSCOR1 and ALNFAC: change REAL variables and arrays to DOUBLE PRECISION, E exponents to D in DATA statements, and ALOG and EXP to DLOG and DEXP respectively.

2. ALNFAC becomes a DOUBLE PRECISION FUNCTION.

# TIME AND ACCURACY

NSCOR2 ran about 30 times faster than NSCOR1 on the ICL 1903A. The execution time is directly proportional to N for both subroutines.

*NSCOR1* in *DOUBLE PRECISION* is accurate to at least seven decimal places on a 36-bit machine; *NSCOR2* is accurate to 0.0001, and usually to five or six decimal places.

### References

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```
SUBROUTINE NSCOR1(S, N, N2, WORK, IFAULT)
С
          ALGORITHM AS 177 APPL. STATIST. (1982) VOL.31, NO.2
С
С
С
          EXACT CALCULATION OF NORMAL SCORES
C
       REAL S(N2), WORK(4, 721)
       REAL ZERO, ONE, C1, D, C, SCOR, AI1, ANI, AN, H, ALNFAC
DATA ONE /1.0EO/, ZERO /0.0EO/, H /0.025EO/, NSTEP /721/
       IFAULT = 3
       IF (N2 .NE. N / 2) RETURN
       IFAULT = 1
       IF (N .LE. 1) RETURN
       IFAULT = 0
       IF (N .GT. 2000) IFAULT = 2
       AN = N
С
С
          CALCULATE NATURAL LOG OF FACTORIAL(N)
С
       C1 = ALNFAC(N)
       D = C1 - ALOG(AN)
С
          ACCUMULATE ORDINATES FOR CALCULATION OF INTEGRAL FOR RANKITS
С
C
      DO 2O I = 1, N2
      I1 = I - 1
      NI = N - I
       AI1 = I1
       ANI = NI
       C = C1 - D
       SCOR = ZERO
       DO 10 J = 1, NSTEP
```

```
10 SCOR = SCOR + EXP(WORK(2, J) + AI1 * WORK(3, J) + ANI * WORK(4, J)
     * + C) * WORK(1, J)
      S(I) = SCOR * H
      D = D + ALOG((AI1 + ONE) / ANI)
   20 CONTINUE
      RETURN
      END
С
      SUBROUTINE INIT(WORK)
С
С
          ALGORITHM AS 177.1 APPL. STATIST. (1982) VOL.31, NO.2
С
      REAL WORK(4, 721)
      REAL XSTART, H, PI2, HALF, XX, ALNORM
DATA XSTART /-9.0E0/, H /0.025E0/, PI2 /-0.918938533E0/,
            HALF /0.5E0/, NSTEP /721/
      XX = XSTART
С
Ċ
          SET UP ARRAYS FOR CALCULATION OF INTEGRAL
С
      DO 10 I = 1, NSTEP
      WORK(1, I) = XX
      WORK(2, I) = PI2 - XX * XX * HALF
WORK(3, I) = ALOG(ALNORM(XX, .TRUE.))
      WORK(4, I) = ALOG(ALNORM(XX, .FALSE.))
      XX = XSTART + FLOAT(I) * H
   10 CONTINUE
      RETURN
      END
С
      REAL FUNCTION ALNFAC(J)
С
          ALGORITHM AS 177.2 APPL. STATIST. (1982) VOL.31, NO.2
С
С
          NATURAL LOGARIT.M OF FACTORIAL FOR NON-NEGATIVE ARGUMENT
С
С
      REAL R(7), ONE, HALF, AO, THREE, FOUR, FOURTN, FORTTY,
     *
        FIVFTY, W,
                     7
     DATA R(1), R(2), R(3), R(4), R(5), R(6), R(7) /0.0E0, 0.0E0,
* 0.69314718056E0, 1.79175946923E0, 3.17805383035E0,
        4.78749174278E0, 6.57925121101E0/
      DATA ONE, HALF, AO, THREE, FOUR, FOURTN, FORTTY, FIVFTY /
      * 1.0E0, 0.5E0, 0.918938533205E0, 3.0E0, 4.0E0, 14.0E0, 420.0E0,
        5040.0E0/
      IF (J .GE. 0) GOTO 10
ALNFAC = ONE
      RETURN
   10 IF (J .GE. 7) GOTO 20
ALNFAC = R(J + 1)
      RETURN
   20 W = J + 1
      Z = ONE / (W * W)
      ALNFAC = (W - HALF) * ALOG(W) - W + AO + (((FOUR - THREE * Z)))
        * Z - FOURTN) * Z + FORTTY) / (FIVFTY * W)
      RETURN
      END
С
      SUBROUTINE NSCOR2(S, N, N2, IFAULT)
С
С
          ALGORITHM AS 177.3 APPL. STATIST. (1982) VOL.31, NO.2
С
С
          APPROXIMATION FOR RANKITS
C
      REAL S(N2), EPS(4), DL1(4), DL2(4), GAM(4), LAM(4), BB, D, B1, AN,
      * AI, E1, E2, L1, CORREC, PPND
DATA EPS(1), EPS(2), EPS(3), EPS(4)
        /0.419885E0, 0.450536E0, 0.456936E0, 0.468488E0/,
     *
            DL1(1), DL1(2), DL1(3), DL1(4)
     *
         /0.112063E0, 0.121770E0, 0.239299E0, 0.215159E0/,
     *
            DL2(1), DL2(2), DL2(3), DL2(4)
         /0.080122E0, 0.111348E0, -0.211867E0, -0.115049E0/,
     *
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GAM(1), GAM(2), GAM(3), GAM(4)
      *
         /0.474798E0, 0.469051E0, 0.208597E0, 0.259784E0/,
      *
         LAM(1), LAM(2), LAM(3), LAM(4)
/0.282765E0, 0.304856E0, 0.407708E0, 0.414093E0/,
      *
      *
             BB /-0.283833E0/, D /-0.106136E0/, B1 /0.5641896E0/
      IFAULT = 3
       IF (N2 .NE. N / 2) RETURN
       IFAULT = 1
       IF (N .LE. 1) RETURN
IFAULT = 0
       IF (N .GT. 2000) IFAULT = 2
       S(1) = B1
       IF (N .EQ. 2) RETURN
С
          CALCULATE NORMAL AREAS FOR 3 LARGEST RANKITS
С
С
       AN = N
       к = 3
       IF (N2 .LT. K) K = N2
       DO 5 I = 1, K
       AT = T
       E1 = (AI - EPS(I)) / (AN + GAM(I))
       E2 = E1 ** LAM(I)
       S(I) = E1 + E2 * (DL1(I) + E2 * DL2(I)) / AN - CORREC(I, N)
     5 CONTINUE
       IF (N2 .EQ. K) GOTO 20
С
          CALCULATE NORMAL AREAS FOR REMAINING RANKITS
С
С
       DO 10 I = 4, N2
       AI = I
       L1 = LAM(4) + BB / (AI + D)
       E1 = (AI - EPS(4)) / (AN + GAM(4))
       E2 = E1 ** L1
       S(I) = E1 + E2 * (DL1(4) + E2 * DL2(4)) / AN - CORREC(I, N)
   10 CONTINUE
С
С
           CONVERT NORMAL TAIL AREAS TO NORMAL DEVIATES
С
   20 \ D0 \ 30 \ I = 1, \ N2
   30 S(I) = -PPND(S(I))
       RETURN
       END
С
       REAL FUNCTION CORREC(I, N)
С
С
           ALGORITHM AS 177.4 APPL. STATIST. (1982) VOL.31, NO.2
С
           CALCULATES CORRECTION FOR TAIL AREA OF NORMAL DISTRIBUTION
С
          CORRESPONDING TO ITH LARGEST RANKIT IN SAMPLE SIZE N.
С
С
       REAL C1(7), C2(7), C3(7), AN, MIC, C14
       DATA C1(1), C1(2), C1(3), C1(4), C1(5), C1(6), C1(7)
        /9.5E0, 28.7E0, 1.9E0, 0.0E0, -7.0E0, -6.2E0, -1.6E0/,
c2(1), c2(2), c2(3), c2(4), c2(5), c2(6), c2(7)
/-6.195E3, -9.569E3, -6.728E3, -17.614E3, -8.278E3, -3.570E3,
      *
      *
          1.075E3/,
      *
         c3(1), c3(2), c3(3), c3(4), c3(5), c3(6), c3(7)
/9.338E4, 1.7516E5, 4.1040E5, 2.157E6, 2.376E6, 2.065E6,
      *
      *
           2.065E6/,
      *
             MIC /1.0E-6/, C14 /1.9E-5/
       CORREC = C14
       IF (I * N .EQ. 4) RETURN
       CORREC = 0.0
       IF (I .LT. 1 .OR. I .GT. 7) RETURN
       IF (I .NE. 4 .AND. N .GT. 20) RETURN
IF (I .EQ. 4 .AND. N .GT. 40) RETURN
       AN = N
       AN = 1.0 / (AN * AN)
       CORREC = (C1(I) + AN * (C2(I) + AN * C3(I))) * MIC
       RETURN
       END
```