



Algorithm AS 190: Probabilities and Upper Quantiles for the Studentized Range

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Source: Journal of the Royal Statistical Society. Series C (Applied Statistics), 1983, Vol.

32, No. 2 (1983), pp. 204-210

Published by: Wiley for the Royal Statistical Society

Stable URL: https://www.jstor.org/stable/2347300

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```
IF (I .LE. LM(1)) RNL = RNL + FLOAT(RL(I, 1)) * ALOG(MEW + A)
      IF (I .LE. LM(2)) RNL = RNL + FLOAT(RL(I, 2)) * ALOG(1.0 - MEW +
        A)
      RNL = RNL - FLOAT(RL(I, 3)) * ALOG(1.0 + A)
    5 CONTINUE
      RETURN
       SUBROUTINE GDER(MEW, THETA, RL, MRL, LM, IDER, RD, PD)
С
C
          ALGORITHM AS 189.4 APPL. STATIST. (1983) VOL.32, NO.2
c
c
          GENERAL DERIVATIVE SUBROUTINE
      REAL MEW, THETA, PD(IDER), A, B, C, D INTEGER RL(MRL, 3), LM(3), RD(2, IDER)
      MLM = LM(3)
      KK = IDER - 1
      DO 5 I = 1, IDER
    5 PD(I) = 0.0
      DO 45 I = 1, MLM
C = FLOAT(I - 1)
       A = C * THETA
      DO 40 J = 1, 3

IF (I .GT. LM(J)) GOTO 40

GOTO (10, 15, 20), J
   10 D = MEW + A
       GOTO 25
   15 D = 1.0 - MEW + A
       GOTO 25
   20 D = 1.0 + A
   25 B = FLOAT(RL(I, J)) / D ** KK
       IF (J .EQ. 3) GOTO 35
DO 30 K = 1, IDER
       PD(K) = PD(K) + FLOAT(RD(J, K)) * B
       B = B \star C
   30 CONTINUE
       GOTO 40
   35 D = -FLOAT(RD(1, 1)) * B * C ** KK
       PD(IDER) = PD(IDER) + D
   40 CONTINUE
   45 CONTINUE
       RETURN
       END
```

# Algorithm AS 190

# Probabilities and Upper Quantiles for the Studentized Range

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[Received January 1981. Revised January 1983]

Keywords: MULTIPLE COMPARISONS; SIMULTANEOUS CONFIDENCE INTERVALS; STUDENTIZED RANGE

# LANGUAGE

Fortran 66

## DESCRIPTION AND PURPOSE

The ratio Q = range/(standard deviation) = W/S is commonly called a studentized range. The

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0035-9254/83/32204 \$2.00

random variable Q is distributed as the studentized range probability distribution whenever W is the range for R independent normal variates having common mean  $\mu$  and variance  $\sigma^2$  and the ratio  $VS^2/\sigma^2$  is an independent chi-squared variate having V degrees of freedom.

A typical application is to produce R sample means by sampling R populations independently with samples of size N. Under an assumption of homogeneous variances, S is calculated as the square root of the within-sample mean square divided by N. The degrees of freedom, V is given by R(N-1). Under the null hypothesis of equal population means, Q is distributed as the studentized range probability distribution. Tables for the distribution are used to formulate multiple comparisons and to construct simultaneous confidence intervals (Miller, 1966).

Most texts on statistical methods contain a table of quantiles for the studentized range, usually only at probability level 0.95. Harter (1969) produced an extensive set of tables for which he claimed six-decimal accuracy in probability.

The purpose of this algorithm is to supplement such tables by approximating probabilities for 0 to Q for arbitrary values of Q, V and R and, given P in the interval (0.90, 0.99) and arbitrary V and R, to approximate the quantile Q. The constants controlling accuracy within the program are set to achieve approximately three decimal place accuracy on the probability scale. The algorithm is expected to have value for integration into computer programs producing simultaneous confidence intervals, multiple comparisons and calculating achieved significance levels for sample ranges.

## Numerical Method for Probability Calculations

The probability integral from zero to Q can be written as

$$P(Q, V, R) = C \int_{0}^{\infty} x^{V-1} e^{-Vx^{2}/2} \left\{ R \int_{-\infty}^{\infty} \theta(y) \left[ \Phi(y) - \Phi(y - Qx) \right]^{R-1} dy \right\} dx \tag{1}$$

where

$$C = \frac{V^{V/2}}{\Gamma\left(\frac{V}{2}\right) 2^{V/2-1}} ,$$

$$\theta(y) = (1/\sqrt{(2\pi)}) e^{-y^2/2}$$

and

$$\Phi(y) = \int_{-\infty}^{y} \theta(t) dt.$$

When the degrees of freedom V are infinite the probability integral takes the simpler form

$$P(Q,R) = R \int_{-\infty}^{\infty} \theta(y) \left[ \Phi(y) - \Phi(y - Q) \right]^{R-1} dy$$
 (2)

The inner integral in (1) (the K Do-loop in PRTRNG) is computed using a composite trapezoid rule and the outer integral (the J Do-loop) is computed using a sine function quadrature rule (Stenger, 1973). Before the computation begins the node associated with the contribution to the maximum probability is located approximately by maximizing the discretized approximation of P as a function of P and P where P and P are the nodes in the trapezoid and sine quadrature rules, respectively. The summation of probability progresses in all directions from the

approximate maximum until the values contributed drop below the cut-off values PCUTK and PCUTJ. A minimum number of steps is specified in each direction to prevent cut-off prior to achieving the maximum when the starting location is poorly located with respect to the maximum. The step sizes, G and H, are varied as functions of V and H to obtain uniform accuracy. (GK, HJ, G) and H are real variables, in PRTRNG.)

# Numerical Method for Quantiles

An initial approximate quantile  $Q_1$  is produced by FUNCTION QTRNGO which utilizes a polynomial function of V, R and T where T is the quantile of Student's t distribution associated with the user specified P. Quantile T is produced by an approximation method due to Peiser (1943) which utilizes a normal quantile produced by FUNCTION GAUINV (Odeh and Evans, 1974). A call to FUNCTION PRTRNG evaluates the probability  $P_1$  corresponding to  $Q_1$ . Knowledge of  $P_1$ , in turn, enables one to use QTRNGO to produce a refined approximation  $Q_2$ . The secant method, which requires two initial values, is then applied iteratively to the error function  $F(Q) = P - P_i$  to reach the desired level of accuracy if this accuracy has not already been attained by  $Q_1$  and  $Q_2$ .

## **STRUCTURE**

FUNCTION PRTRNG(Q, V, R, IFAULT) FUNCTION QTRNG(P, V, R, IFAULT)

## Formal parameters

| P | Real | input: lower side cumulative probability, $0.90 \le P \le 0.99$ |
|---|------|---|
| Q | Real | input: upper limit of studentized range, lower limit is zero    |
| V | Real | input: degrees of freedom, $V \ge 1.0$                          |
| R | Real | input: number of samples, $R \ge 2.0$                           |

IFAULT Integer output: failure indicator,

Failure indications

IFAULT = 0 is no error

- = 1 if V < 1.0 or R < 2.0
- = 2 if P < 0.90 or P > 0.99 in QTRNG
- = 9 if an error occurs in *FUNCTION GAUINV* used by *QTRNG*. The error in *GAUINV* cannot occur with current settings of constants

Auxiliary algorithms

FUNCTION ALNORM(X, UPPER) — Algorithm AS 66 (Hill, 1973). FUNCTION GAUINV(P, IFAULT) — Algorithm AS 70 (Odeh and Evans, 1974).

Other algorithms may be substituted for ALNORM but the user must be aware that accuracy in PRTRNG is strongly dependent upon accuracy of such normal probabilities. However, accuracy in the extreme tails is not essential. An additional statement may be inserted in ALNORM to omit actual calculation whenever |X| > 3.62 but assign 0.0 to ALNORM for X < -3.62 and 1.0 for X > 3.62. This change produces a negligible loss in accuracy to three decimals but provides a significant time reduction. The particular substitution for the statement labelled 10 in ALNORM is

10 IF (Z.GT.-3.62 AND. Z.LT.3.62) GOTO 20

#### **ACCURACY**

The accuracy of *PRTRNG* is evaluated by a comparison with the tables published by Harter (1969) for the settings of all combinations of P = 0.001, 0.01, 0.05, 0.10, 0.50, 0.90, 0.95, 0.99, 0.999, V = 2, 8, 30, 120,  $\infty$  and R = 2, 8, 30, 100. Harter claimed accuracy to six decimals. A maximum difference (or error) of 0.0054 was obtained for the rarely encountered combination of P = 0.10, V = 2 and R = 100, for the constants used in the present program. All but four of the

180 settings tested produced differences less than 0.0005. Nearly four decimal place accuracy was achieved for all cases with  $V \ge 8$ .

The accuracy of QTRNG was established by following its call by one additional call to the  $FUNCTION\ PRTRNG$  to validate the probability of the quantile produced. A test run was based on all combinations of the parameter levels of  $P=0.90,\ 0.95,\ 0.99;\ V=2,\ 8,\ 30,\ 120,\ \infty$  and  $R=2,\ 8,\ 30,\ 100$ . Differences or errors in probability were less than 0.0005 in nearly all cases. It should be noted that PRTRNG also contains a maximum error of about 0.0005 for these values of the parameters. Accuracy testing utilized 36 bit real variables.

## Constants influencing accuracy

The accuracy and execution time of the quadrature rule used in PRTRNG is strongly influenced by the fineness of the node spacing. The constant STEP controls the node spacing in both the x (J in the program with step H) and y (K in the program with step G) directions. The minimum (maximum) number of nodes is controlled in the X and Y directions by YMIN (YMAX) and YMIN (YMAX), respectively. The actual truncation of the numerical quadrature rule is controlled within the limits defined by YMIN, YMAX, YMIN and YMAX by measuring the probability contributed at each node. YMIN is the lower limit for the inclusion of pairs of nodes symmetric about the midpoint in the X direction and YMIN is the lower limit of pairs of rows of nodes (the Y direction). That is: given a row Y, the procedure starts at the midpoint of the row and works outward in calculating the probability at the nodes symmetric with respect to the midpoint. Rows are then computed in a symmetric outward fashion (increasing Y).

Any alterations in PRTRNG of the limits JMIN, JMAX, KMIN and KMAX, the arrays  $QW(\cdot)$  and  $VW(\cdot)$  and  $(STEP)^{-1}$  should be performed proportionally. Any increase in the value of JMAX requires the dimension of each of the arrays QW and VW to be increased to at least twice the new value of JMAX. However, to obtain large improvements in accuracy both a conversion to double precision in arithmetic operations as well as a reduction in PCUTJ and PCUTK would be required.

If the use of PRTRNG is restricted to cases for which  $P \ge 0.90$  and  $V \ge 8$ , approximately three digit accuracy can be achieved by resetting the constants to JMIN = 2, KMIN = 4 and STEP = 0.9. Such a constant setting reduces execution time by about two-thirds. If this setting is used for all P, but with  $V \ge 8$ , errors become as high as 0.01. Allowing V to be as low as 2 can produce errors as high as 0.05. The errors are of size approximately proportional to P for P < 0.5 and 1 - P for P > 0.5.

In QTRNG, the constants JMAX and PCUT were selected to produce about three decimal place accuracy in the probability corresponding to the approximated quantile. JMAX (which has a minimum value of two) controls the maximum number of calls to PRTRNG. PCUT controls termination of the refinement process prior to reaching JMAX. Any adjustments in accuracy in PRTRNG will lead to corresponding alterations of accuracy in QTRNG.

#### **TIMING**

Execution time for *PRTRNG* can be approximated by determination of the elementary operations performed. The median number of nodes evaluated was 135 for the current constant setting for the test combinations treated in the section on accuracy. The evaluation at each node requires approximately six additions and a single each of multiplication, exponentiation, logarithm computation and a call to *ALNORM*. The call to *ALNORM* uses at least seven additions and five multiplication-divisions.

Operation time for QTRNG perhaps can best be specified as a multiple of the number of calls to FUNCTION PRTRNG which is the major time-using procedure. The test run referenced in the section on accuracy required a median of only two calls to PRTRNG. About one-sixth of the approximations reached the required accuracy level with only one call of PRTRNG while another one-sixth required three or four calls to PRTRNG.

#### ADDITIONAL COMMENTS

The function QTRNGO may have independent use for fast but inexact quantiles for P in the interval of 0.80 to 0.99. For the test run referenced in the section on accuracy, only one-sixth of the initial quantiles exceeded an error of 0.02 on the probability scale and no errors exceeded 0.05. Errors are approximately proportional to 1-P. The largest errors occur for V=2. If the case of V=2 was eliminated when attempting to obtain quantiles for 0.99, the largest error was 0.006 on the probability scale.

#### RELATED ALGORITHM

Dunlap et al. (1977) published an algorithm for probabilities for the studentized range. It requires an evaluation of the integrand at 1032 nodes to produce accuracy to about four decimals. He excluded the troublesome case of V < 3 which is allowed herein.

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```
FUNCTION PRTRNG(Q, V, R, IFAULT)
C
C
           ALGORITHM AS 190 APPL. STATIST. (1983) VOL.32, NO.2
С
C
C
           EVALUATES THE PROBABILITY FROM O TO Q FOR A STUDENTIZED
           RANGE HAVING V DEGREES OF FREEDOM AND R SAMPLES.
C
           USES FUNCTION ALNORM - ALGORITHM AS 66.
0000
           ARRAYS VW AND QW STORE TRANSIENT VALUES USED IN THE
           QUADRATURE SUMMATION.
                                        NODE SPACING IS CONTROLLED BY
                    PCUTJ AND PCUTK CONTROL TRUNCATION.
C
C
           STEP.
           MINIMUM AND MAXIMUM NUMBER OF STEPS ARE CONTROLLED BY
           JMIN, JMAX, KMIN AND KMAX.
                                              ACCURACY CAN BE INCREASED
C
           BY USE OF A FINER GRID - INCREASE SIZES OF ARRAYS VW
C
           AND QW, AND JMIN, JMAX, KMIN, KMAX AND 1/STEP PROPORTIONALLY.
       REAL Q, V, R, VW(30), QW(30), PCUTJ, PCUTK, STEP, VMAX, ZERO,
      * FIFTH, HALF, ONE, TWO, CV1, CV2, CVMAX, CV(4)

DATA PCUTJ, PCUTK, STEP, VMAX /0.00003E0, 0.0001E0, 0.45E0,

* 120.0E0/, ZERO, FIFTH, HALF, ONE, TWO /0.0E0, 0.2E0, 0.5E0,

* 1.0E0, 2.0E0/, CV1, CV2, CVMAX /0.193064705E0, 0.293525326E0,
         0.39894228E0/, cv(1), cv(2), cv(3), cv(4) /0.318309886E0, -0.268132716E-2, 0.347222222E-2, 0.833333333E-1/
       DATA JMIN, JMAX, KMIN, KMAX /3, 15, 7, 15/
С
           CHECK INITIAL VALUES.
       PRTRNG = 7FRO
       IFAULT = 0
       IF (V .LT. ONE .OR. R .LT. TWO) IFAULT = 1
       IF (Q .LE. ZERO .OR. IFAULT .EQ. 1) GOTO 99
C
           COMPUTING CONSTANTS, LOCATING MIDPOINT, ADJUSTING STEPS.
```

```
G = STEP * R ** (-FIFTH)
       GMID = HALF * ALOG(R)
       R1 = R - ONE
        C = ALOG(R * G * CVMAX)
       IF (C .GT. VMAX) GOTO 20
C
       H = STEP * V ** (-HALF)
        V2 = V * HALF
       IF (V .EQ. ONE) C = CV1
IF (V .EQ. TWO) C = CV2
      IF (.NOT.(V .EQ. ONE .OR. V .EQ. TWO)) C = SQRT(V2) * CV(1) * / (ONE + ((CV(2) / V2 + CV(3)) / V2 + CV(4)) / V2)
       C = ALOG(C * R * G * H)
С
           COMPUTING INTEGRAL.
           GIVEN A ROW K, THE PROCEDURE STARTS AT THE MIDPOINT AND WORKS OUTWARD (INDEX J) IN CALCULATING THE PROBABILITY AT NODES SYMMETRIC ABOUT THE MIDPOINT. THE ROWS (INDEX K) ARE ALSO
           PROCESSED OUTWARDS SYMMETRICALLY ABOUT THE MIDPOINT.
           CENTRE ROW IS UNPAIRED.
   20 \text{ GSTEP} = G
        QW(1) = -ONE
        QW(JMAX + 1) = -ONE
       PK1 = ONE
       PK2 = ONE
       DO 28 K = 1, KMAX
       GSTEP = GSTEP - G
    21 GSTEP = -GSTEP
       GK = GMID + GSTEP
       PK = ZERO
       IF (PK2 .LE. PCUTK .AND. K .GT. KMIN) GOTO 26 WO = C - GK * GK * HALF
       PZ = ALNORM(GK, .TRUE.)

X = ALNORM(GK - Q, .TRUE.) - PZ

IF (X .GT. ZERO) PK = EXP(WO + R1 * ALOG(X))

IF (V .GT. VMAX) GOTO 26
C
        JUMP = -JMAX
    22 JUMP = JUMP + JMAX
        DO 24 J = 1, JMAX
        JJ = J + JUMP
        IF (QW(JJ) .GT. ZERO) GOTO 23
       HJ = H * FLOAT(J)
        IF (J .LT. JMAX) QW(JJ + 1) = -ONE
        EHJ = EXP(HJ)
        QW(JJ) = Q * EHJ
        VW(JJ) = V * (HJ + HALF - EHJ * EHJ * HALF)
r
    23 PJ = ZERO
        X = ALNORM(GK - QW(JJ), .TRUE.) - PZ
        IF (X .GT. ZERO) PJ = \acute{E}XP(WO + VW(JJ) + R1 * ALOG(X))
        PK = PK + PJ
        IF (PJ .GT. PCUTJ) GOTO 24
IF (JJ .GT. JMIN .OR. K .GT. KMIN) GOTO 25
    24 CONTINUE
    25 H = -H
        IF (H .LT. ZERO) GOTO 22
    26 PRTRNG = PRTRNG + PK
        IF (K .GT. KMIN .AND. PK .LE. PCUTK .AND. PK1 .LE. PCUTK) GOTO 99
        PK2 = PK1
        PK1 = PK
        IF (GSTEP .GT. ZERO) GOTO 21
    28 CONTINUE
C
    99 RETURN
        END
С
        FUNCTION QTRNG(P, V, R, IFAULT)
           ALGORITHM AS 190.1 APPL. STATIST. (1983) VOL.32, NO.2
```

```
APPROXIMATES THE QUANTILE P FOR A STUDENTIZED RANGE DISTRIBUTION HAVING V DEGREES OF FREEDOM AND R SAMPLES
С
C
              FOR PROBABILITY P, P.GE.O.90 .AND. P.LE.O.99.
С
              USES FUNCTIONS ALNORM, GAUINV, PRTRNG AND QTRNGO - ALGORITHMS AS 66, AS 70, AS 190 AND AS 190.2
C
C
        REAL P, V, R, PCUT, P75, P80, P90, P99, P995, P175, ONE, TWO, FIVE DATA JMAX, PCUT, P75, P80, P90, P99, P995, P175, ONE, TWO, FIVE / * 8, 0.001E0, 0.75E0, 0.80E0, 0.90E0, 0.99E0, 0.995E0, 1.75E0,
        * 1.0E0, 2.0E0, 5.0E0/
C
               CHECK INPUT PARAMETERS
C
C
          IFAULT = 0
          NFAULT = 0
         IF (V .LT. ONE .OR. R .GT. TWO) IFAULT = 1
IF (P .LT. P90 .OR. P .GT. P99) IFAULT = 2
IF (IFAULT .NE. 0) GOTO 99
C
               OBTAIN INITIAL VALUES
         Q1 = QTRNGO(P, V, R, NFAULT)
IF (NFAULT .NE. 0) GOTO 99
P1 = PRTRNG(Q1, V, R, NFAULT)
IF (NFAULT .NE. 0) GOTO 99
          QTRNG = Q1
         IF (ABS(P1 - P) .LT. PCUT) GOTO 99

IF (P1 .GT. P) P1 = P175 * P - P75 * P1

IF (P1 .LT. P) P2 = P + (P - P1) * (ONE - P) / (ONE - P1) * P75
         IF (P2 .LT. P80) P2 = P80

IF (P2 .GT. P995) P2 = P995

Q2 = QTRNGO(P2, V, R, NFAULT)

IF (NFAULT .NE. 0) GOTO 99
               REFINE APPROXIMATION
r
          DO 14 J = 2, JMAX
          P2 = PRTRNG(Q2, V, R, NFAULT)
IF (NFAULT .NE. 0) GOTO 99
          E1 = P1 - P
          E2 = P2 - P
          QTRNG = (E2 * Q1 - E1 * Q2) / (E2 - E1)
          IF (ABS(E1) .LT. ABS(E2)) GOTO 12
          Q1 = Q2
          P1 = P2
     12 IF (ABS(P1 - P) .LT. PCUT * FIVE) GOTO 99
          Q2 = QTRNG
     14 CONTINUE
С
     99 IF (NFAULT .NE. O) IFAULT = 9
          RETURN
С
          FUNCTION QTRNGO(P, V, R, IFAULT)
C
C
               ALGORITHM AS 190.2 APPL. STATIST. (1983) VOL.32, NO.2
               CALCULATES AN INITIAL QUANTILE P FOR A STUDENTIZED RANGE DISTRIBUTION HAVING V DEGREES OF FREEDOM AND R SAMPLES
               FOR PROBABILITY P, P.GT.O.80.AND.P.LT.O.995.
               USES FUNCTION GAUINV - ALGORITHM AS 70
C
         REAL P, V, R, Q, T, VMAX, HALF, ONE, FOUR, C1, C2, C3, C4, C5
DATA VMAX, HALF, ONE, FOUR, C1, C2, C3, C4, C5 /120.0E0, 0.5E0,
* 1.0E0, 4.0E0, 0.8843E0, 0.2368E0, 1.214E0, 1.208E0, 1.4142E0/
C
          T = GAUINV(HALF + HALF * P, IFAULT)
IF (V .LT. VMAX) T = T + (T * T * T + T) / V / FOUR
          Q = C1 - C2 * T
          IF (V .LT. VMAX) Q = Q - C3 / V + C4 * T / V
          QTRNGO = T * (Q * ALOG(R - ONE) + C5)
          RETURN
          END
```