RANK ORDER STATISTICS FOR UNEQUAL SAMPLES

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1. Introduction and Relevant Statistics

Suppose $F_n(x)$ and $G_n(x)$ are the empirical distribution functions of two independent samples $(x_1, x_2, ..., x_n)$ and $(y_1, y_2, ..., y_n)$ drawn respectively from populations with continuous distribution functions F(x) and G(x). Employing complicated methods Smirnov derived in 1939 the probability distribution of the statistic

$$D_{n, n}^{+} = \sup_{x} [F_{n}(x) - G_{n}(x)]$$

under the null hypothesis $F(x) \equiv G(x)$. Gnedenko and Korolyuk found the probability distribution of $D_{n,n}^+$ by using the random walk model or the geometric theory of paths. In 1960 Reimann and Vincze [2] considered the case of two unequal samples and derived the distribution of the statistic

$$D_{m,n}^+ = \sup_{x} [m F_m(x) - n G_n(x)]$$

under the same null hypothesis. For equal sample sizes, Sujan [3] obtained in 1971 the joint distribution of $D_{n,n}^+$ and $R_{n,n}$, the total number of runs of x's and y's. Here we obtain in generalization of her results the joint probability distribution of the rank order statistics $D_{m,n}^+$ and $R_{m,n}$ by using combinatorial methods.

Given two samples $(x_1, x_2, ..., x_m)$ and $(y_1, y_2, ..., y_n)$ of sizes m and $n (\leq m)$ with observations in ascending order of magnitude we pool them and associate a random variable θ_i with the ith observation such that

$$\theta_i = \begin{cases} +1, & \text{if the ith observation is an } x \\ -1, & \text{if the ith observation is a } y \end{cases}$$

Define $S_0 \equiv 0$ and $S_i \equiv \theta_1 + \theta_2 + \cdots + \theta_i$.

If the points (i, S_i) are joined one with the next by straight segments, we obtain a graphical representation of the sequence $\{S_i\}$. Denoting by $R_{m,n}$ the total number of runs of (+1)'s and (-1)'s, our object is to determine

$$P\{D_{m,n}^+ \le t, R_{m,n} = \rho\}; \ t \ge m - n, \ 2 \le \rho \le 2n + 1$$
 (1)

Now
$$D_{m,n}^+ \leq t$$
, if $\max_{1 \leq i \leq m+n} S_i \leq t$.

Hence (1) is the same as

$$P \{ \max_{1 \le i \le m+n} S_i \le t, R_{m,n} = \rho \}; t \ge m-n, 2 \le \rho \le 2n+1 (2)$$

2. Joint Distribution of $D_{m,n}^+$ and $R_{m,n}$

Theorem 1. For $t \ge m - n \ge 0$, $1 \le r \le n$

$${\binom{m+n}{m}} P \left\{ D_{m,n}^{+} \le t, R_{m,n} = 2 r \right\} = 2 {\binom{m-1}{r-1}} {\binom{n-1}{r-1}} - {\binom{m-t-1}{r-1}} {\binom{n+t-1}{r-1}} - {\binom{m-t-1}{r}} {\binom{n+t-1}{r-2}}$$
(3a)

and for $t \ge m - n \ge 0$, $1 \le r \le n - 1$,

$${\binom{m+n}{m}} P \left\{ D_{m,n}^{+} \leqslant t, \ R_{m,n} = 2 \ r+1 \right\} = {\binom{m-1}{r}} {\binom{n-1}{r-1}} + {\binom{m-1}{r-1}} {\binom{n-1}{r}} - 2 {\binom{m-t-1}{r}} {\binom{n+t-1}{r-1}}$$
(3b)

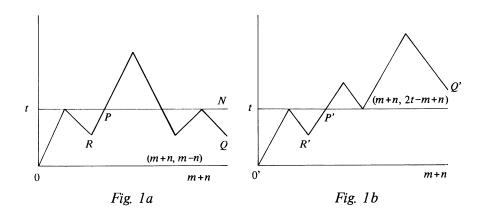
Proof. PART I. First let $R_{m,n} = 2 r$

The total number of runs in a path being 2r, there are r runs* each of (+1)'s and (-1)'s and the number of admissible paths is

$$2\binom{m-1}{r-1}\binom{n-1}{r-1} \tag{4}$$

the factor 2 accounting for the two possibilities that the first run is one of (+1)'s or of (-1)'s. From this we have to subtract the number of paths which violate the condition max $S_i \le t$. Now two cases arise:

Case 1. The path with max $S_i > t$ starts with a positive run and ends with a negative one.



^{*} We shall find it convenient to call a run of (+1)'s a positive run and a run of (-1)'s a negative run, and to abreviate the phrase 'Number of positive (negative) runs in a path OP' by $\rho_p(OP)$ and $\rho_n(OP)$.

For a path OQ belonging to this category, let P be the first crossing point with the line y = t. Applying the operation* α on OP and φ on PQ, we get the path O'Q' (Fig. 1b). Symbolically,

$$O'Q' = \alpha(OP) + \varphi(PQ)$$

Now the characteristic of the segment PQ is that it starts with a step + 1 and ends with a - 1. Hence the φ -operation applied on PQ yields the segment P'Q', again starting with a + 1 and ending with a - 1. Also $\rho_P(PQ) = \rho_n(PQ)$ and the positive runs in PQ correspond to negative runs in P'Q' and viceversa; hence runs of the two kinds are equal in number in P'Q' as well, with the first run in P'Q' (corresponding to the last one in PQ) becoming a positive run. Also the last runs PQ in PQ and PQ' in PQ are positive runs as each one leads to the line PQ and PQ' the first run is in continuation of a positive run and

$$\rho_p(O'Q') = \rho_p(OQ) = \rho_n(O'Q') = \rho_n(OQ)$$

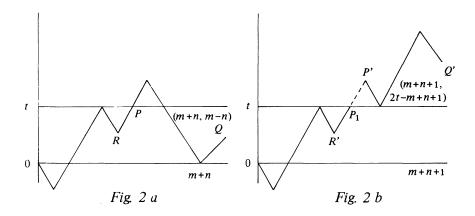
Q is the point (m+n, m-n) and the β -operation on PQ (viz. reflection in PN: y=t) transfers Q to Q' (m+n, 2t-m+n). A further γ -operation on it leaves the end points undisplaced. Hence the $\beta*\gamma\equiv\varphi$ -operation on PQ while retaining P' as an end point brings the other end point to the position Q'(m+n, 2t-m+n), so that there result (n+t) positive and (m-t) negative steps in O'Q'. Thus each one of the paths violating the condition max $S_i\leqslant t$ corresponds to one having (n+t) positive and (m-t) negative steps as also r positive and r negative runs. Hence** the total number of paths of this type is

$$\binom{n+t-1}{r-1}\binom{m-t-1}{r-1} \tag{5}$$

^{*} The operations α , β , γ have been defined by Kanwar Sen [1]. The φ -operation (equivalent to $\beta * \gamma$) is a new one, transforming the path $(\theta_1, \theta_2, ..., \theta_n)$ into the path $(-\theta_n, -\theta_{n-1}, ..., -\theta_1)$.

^{**} The 1-1 correspondence between the sets of paths here and et seq can be easily demonstrated.

Case 2. The path with max $S_i > t$ starts with a negative run and ends with a positive one.



For such a path OQ (Fig. 2a), let P be the first crossing point with the line y = t. Since the last run in PQ is a positive one, the φ -operation transforms it into a segment beginning with a negative run at P; consequently P loses its identity as the first crossing point and a 1-1 correspondence cannot be set up. However, if we adjoin a unit positive segment P_1P' at P_1 (Fig. 2b) and join $\varphi(PQ)$ at P', the identity of P_1 as the point of first crossing is maintained and the unit segment P_1P' is followed by a negative run corresponding to the last positive run in OQ. The segment OR, R being the initial point of the run passing through P, starts as well as ends with a negative run. Hence

$$\rho_n(OR) = \rho_p(OR) + 1 = s$$
, say

Now

$$\rho_p(OQ) = \rho_n(OQ) = r$$

hence

$$\rho_p(RQ) = r - s + 1 = \rho_n(RQ) + 1$$

Further O'R' is the same as OR, R'P' consists of one positive run and for $P'Q' \equiv \varphi(PQ)$.

$$\rho_p(P'Q') = \rho_n(RQ)$$
 and $\rho_n(P'Q') = \rho_p(RQ)$

hence

 $P'Q' \equiv \varphi(PQ)$

O'Q'

$$\rho_p(O'Q') = r = \rho_n(O'Q') - 1$$

The number of runs is exhibited in the first three columns of the table below:

 $R_{m, n} = 2 r + 1$ $R_{m, n} = 2 r$ Segment Positive Negative Positive Negative runs runs runs runs OQr+1 $OR \equiv O'R'$ s -- 1 S S S r - s + 1r - s + 1RQR'P'1 0 1 0

Table 1

This case differs from Case 1 in the addition of a unit positive segment P_1P' . Hence the terminal point is Q'(m+n+1, 2t-m+n+1) and O'Q' comprises n+t+1 positive and m-t negative steps and

r - s + 1

r+1

$$\rho_p(O'Q') = r = \rho_n(O'Q') - 1$$

consequently the total number of such paths is

r-s

r

$$\binom{n+t}{r-1}\binom{m-t-1}{r} \tag{6}$$

r-s

r+1

r - s + 1

r+1

But a path like O'Q' has the segment P_1P' only of unit length; hence from (6) we have to subtract the number of paths which lead

from P_1 to Q' beginning with two or more positive steps. On taking away the first unit segment P_1P' from such a path, we are left with a similar path beginning with a positive run of one or more steps and their number, obtained from (6) on replacing n by n-1, is

$$\binom{n+t-1}{r-1}\binom{m-t-1}{r} \tag{7}$$

Thus the required number of paths violating the condition max $S_i \le t$, starting with a negative run and ending with a positive run, is

$$\begin{bmatrix} \binom{n+t}{r-1} - \binom{n+t-1}{r-1} \end{bmatrix} \binom{m-t-1}{r} = \binom{n+t-1}{r-2} \binom{m-t-1}{r} (8)$$

Combining the results (2), (4), (5) and (8) and noting that with m positive and n negative steps the total number of possible paths is $\binom{m+n}{m}$, we prove (3a), generalizing the result obtained by Sujan [3] for the case m=n.

PART II. Let $R_{m, n} = 2 r + 1$

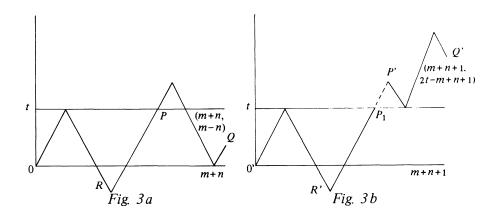
Now each path has r + 1 runs of one type and r runs of the other, hence the number of such paths is

$$\binom{m-1}{r}\binom{n-1}{r-1} + \binom{m-1}{r-1}\binom{n-1}{r} \tag{9}$$

From this we have to subtract the number of paths which violate the condition $\max S_i \le t$. Now two cases arise:

Case 3. A path with max $S_i > t$ has r + 1 positive and r negative runs.

The numbers of positive and negative runs in the various segments after the interposition of a unit positive segment P_1P' (fig. 3a) are

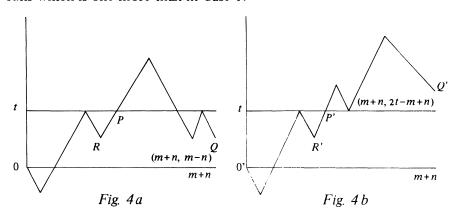


exhibited in the last two columns of Table 1. The terminal point is Q'(m+n+1, 2t-m+n+1) and Q'Q' consists of n+t+1 positive and m-t negative steps; also $\rho_n(O'Q') = \rho_p(O'Q') = r+1$. Consequently as in Case 2 the number of possible paths now is

$$\binom{n+t}{r}\binom{m-t-1}{r} - \binom{n+t-1}{r}\binom{m-t-1}{r} =$$

$$= \binom{n+t-1}{r-1}\binom{m-t-1}{r}$$
(10)

Case 4. A path with max $S_i > t$ has r positive and r + 1 negative runs which is one more than in Case 1.



Proceeding as in Case 1, each path violating the condition max

 $S_i \le t$ is seen to contain n+t positive and m-t negative steps, as also r positive and r+1 negative runs. Hence their number is

$$\binom{n+t-1}{r-1}\binom{m-t-1}{r} \tag{11}$$

Combining the results (9), (10) and (11), we prove (3b), generalizing Sujan's another result.

3. Limiting Distribution

Theorem 2. If g, u, y be some fixed finite constants, $m = N + g\sqrt{N} + 0(1)$ and $n = N - g\sqrt{N} + 0(1)$, then*

$$\lim_{N \to \infty} P\{D_{m, n}^{+} \leq (g - y)\sqrt{N}, \ R_{m, n} \leq N + u\sqrt{N}\} =$$

$$= \frac{1}{\sqrt{\pi}} (1 - e^{g^{2} - y^{2}}) \int_{-\infty}^{u} e^{-x^{2}} dx$$
(11a)

Proof. If a, g, h, k, w, x denote finite constants, N denotes a large number and $0 \le x \le 1$, then using Stirling's asymptotic formula:

max. ordinate of the path
$$\equiv D_{m,n}^+ \ge m - n \ge 0$$

by hypothesis of Th. 1. Thus the condition $D_{m,n}^+ \leq (g-y)N^{1/2}$ is meaningful for $g-y \geq 0$. Also from (11a) and (1),

$$(g-y)N^{1/2} = t$$
 has to be $\ge m - n = 2 g N^{1/2} + 0 (1)$,

by hypothesis of Th. 2,

i.e.
$$g - v \ge 2g$$
, or $g + y \le 0$

Also $g y \ge 0$, as shown above; hence the result.

^{*} To show that $g^2 \le y^2$, we see that the terminal point of the path is (m+n, m-n). Hence

$$n! = \sqrt{2\pi} n^{n+1/2} e^{-n} [1 + 0 (1/n)]$$

it is found that for large N,

$$(aN + wN^{x} + g)! / [\sqrt{2\pi} (aN)^{aN + wN^{x} + g + \frac{1}{2}}] =$$

$$= \exp \left[-(aN + wN^{x} + g) + \frac{1}{2} \right] \log \left\{ 1 + (wN^{x} + g)/(aN) \right\} \left[1 + 0(N^{-\frac{1}{2}}) \right]$$

$$= \exp \left[-aN + \left(wN^{x} + g + \frac{1}{2} \right) \left(\frac{wN^{x} + g}{aN} \right) + \left(aN + wN^{x} + g + \frac{1}{2} \right) \right] \times$$

$$\times \left\{ -\frac{w^{2}N^{2x} + 2wgN^{x}}{2a^{2}N^{2}} + \frac{w^{3}N^{3x}}{3a^{3}N^{3}} + 0 \left(\frac{1}{N^{2}} \right) + 0 \left(\frac{1}{N^{3-2x}} \right) \right\} \right] \times$$

$$\times \left[1 + 0 \left(\frac{1}{\sqrt{N}} \right) \right] =$$

$$= \exp \left[-aN + (w^{2}/2a)N^{2x-1} + 0(N^{x-1}) + 0(N^{3x-2}) + 0(N^{-\frac{1}{2}}) \right]$$

$$= \exp \left[-aN + (w^{2}/2a)N^{2x-1} \right] \left[1 + 0(1) + 0(N^{2x-1}) \right]$$

whence

When x > 1/2, this as $N \to \infty$ diminishes like $\exp(-2 w^2 N^{2x-1})$. When $x \le 1/2$, the exponent [] is 0(1) and the number 0(N^x) of combinatorial expressions which are of the same order of magnitude is largest when x = 1/2. Hence we take x = 1/2.

For large N and finite a, f, k, (a > 0)

$$(aN + f\sqrt{N} + k)! / [\sqrt{2\pi} (aN)^{aN+f\sqrt{N}+k+\frac{1}{2}}] =$$

$$= \exp\left[-(aN + f\sqrt{N} + k) + aN + f\sqrt{N} + k + \frac{1}{2}\right] \times \left\{ \frac{f\sqrt{N} + k}{aN} - \frac{f^2N + 2fk\sqrt{N}}{2a^2N^2} + \frac{f^3}{3a^3N^{3/2}} + 0\left(\frac{1}{N^2}\right) \right\} \right] = \exp\left[-aN + \frac{f^2}{2a} + \frac{f}{a\sqrt{N}}\left(k + \frac{1}{2} - \frac{f^2}{6a}\right) + 0\left(\frac{1}{N}\right)\right]$$

We thus have for ready reference the following asymptotic behaviour:

For large N and finite g, h, k, w

$$\binom{N+g\sqrt{N}+k}{\frac{1}{2}N+w\sqrt{N}+h} / [2^{N+g\sqrt{N}+k}\sqrt{2/\pi N}] =$$

$$= \exp\left[\frac{1}{2}g^2 - w^2 - (g-w)^2 + \frac{1}{\sqrt{N}}\left\{gk + \frac{1}{2}g - \frac{1}{6}g^3 - 2wh - w + \frac{2}{3}w^3 - 2(g-w)\left(k - h + \frac{1}{2}\right) + \frac{2}{3}(g-w)^3\right\} +$$

$$+ 0\left(\frac{1}{N}\right) = \exp\left[-\frac{1}{2}\left[(g-2w)^2 - N^{-1/2}\left\{2(g-2w)(2h-k) - g + g(g-2w)^2\right\}\right] \left\{1 + 0(1/N)\right\}$$

We now investigate the asymptotic behaviour of

$$P_{1} = \left[2\binom{m-1}{r-1}\binom{n-1}{r-1} - \binom{m-t-1}{r-1}\binom{n+t-1}{r-1} - \binom{m-t-1}{r}\binom{n+t-1}{r-2}\right] \div \binom{m+n}{m}$$

when, with $m-1=N+g\sqrt{N}$, $n-1=N-g\sqrt{N}$, $t=(g-y)\sqrt{N}$ and r=0(N), g, y being finite, N tends to ∞ .

We observe that for large N, combinatorial expressions above are dominant when r is about half of m or n or m-t or n+t. We, therefore, take $r-1=\frac{1}{2}N+w\sqrt{N}$. Then

$$P_{1} \sim \left[2 \left(\frac{N + g\sqrt{N}}{\frac{1}{2}N + w\sqrt{N}} \right) \left(\frac{N - g\sqrt{N}}{\frac{1}{2}N + w\sqrt{N}} \right) - \left(\frac{N + y\sqrt{N}}{\frac{1}{2}N + w\sqrt{N}} \right) \left(\frac{N - y\sqrt{N}}{\frac{1}{2}N + w\sqrt{N}} \right) - \left(\frac{N + y\sqrt{N}}{\frac{1}{2}N + w\sqrt{N}} \right) \left(\frac{N - y\sqrt{N}}{\frac{1}{2}N + w\sqrt{N}} \right) \right] \div \left(\frac{2N + 2}{N + g\sqrt{N} + 1} \right) (12)$$

In magnitude the 2nd product in $(12) = 2^{N+y\sqrt{N}} \sqrt{2/\pi N} \times \exp\left[-\frac{1}{2}(y-2w)^2 + \frac{1}{2\sqrt{N}}y\left\{(y-2w)^2 - 1\right\}\right] \times \text{ [a similar expression with y replaces by } -y\text{] } [1+0(1/N)]$

$$= \frac{2^{2N+1}}{\pi N} \exp\left[-y^2 - 4w^2 - \frac{4y^2w}{\sqrt{N}}\right] [1 + 0(1/N)]$$

$$= \frac{2^{2N+1}}{\pi N} e^{-y^2 - 4w^2} \left[1 - \frac{4y^2w}{\sqrt{N}} + 0(1/N)\right]$$
(13)

In magnitude the 3rd product in (12) after some simplification

= [Expression (12)] × exp
$$\frac{4y}{\sqrt{N}}$$

= $\frac{2^{2N+1}}{\pi N} e^{-y^2 - 4w^2} \left[1 + \frac{4y(1-wy)}{\sqrt{N}} + 0(1/N) \right]$

The 1st product in (12) = 2 [Expression (13) with y replaced by g].

The divisor in (12) =
$$2^{2N+2} \sqrt{1/\pi N} e^{-g^2} + 0 (N^{-3/2})$$

Hence
$$P_1 = \frac{1}{2\sqrt{2\pi N}} e^{-4w^2} \left[2\left(1 - \frac{4g^2w}{\sqrt{N}}\right) - e^{g^2 - y^2} \times \left\{ 2 + \frac{4y(1-2wy)}{\sqrt{N}} \right\} + 0(1/N) \right]$$

$$= \frac{1}{\sqrt{\pi N}} e^{-4w^2} \left[1 - e^{g^2 - y^2} - \frac{2}{\sqrt{N}} \left\{ 2g^2w + e^{g^2 - y^2} (y - 2y^2w) \right\} + 0(1/N) \right]$$

Again,

$$P_{2} = \left[\binom{m-1}{r} \binom{n-1}{r-1} + \binom{m-1}{r-1} \binom{n-1}{r} - \frac{2\binom{m-t-1}{r} \binom{n+t-1}{r-1}}{r} + \binom{m-1}{r-1} \binom{n-1}{r} - \frac{2\binom{m-t-1}{r} \binom{n+t-1}{r-1}}{r} \right] \div \binom{m+n}{m}$$

$$= \left[\binom{N+g\sqrt{N}}{\frac{1}{2}N+w\sqrt{N}+1} \binom{N-g\sqrt{N}}{\frac{1}{2}N+w\sqrt{N}+1} + \binom{N+g\sqrt{N}}{\frac{1}{2}N+w\sqrt{N}+1} - \frac{N-g\sqrt{N}}{\frac{1}{2}N+w\sqrt{N}+1} - \frac{N-g\sqrt{N}}{\frac{1}{2}N+w\sqrt{N}} \right] \binom{N-g\sqrt{N}}{\frac{1}{2}N+w\sqrt{N}+1}$$

$$= \frac{1}{2\sqrt{\pi N}} e^{-4w^{2}} \left[e^{2(g-2w)/\sqrt{N}} + e^{-2(g+2w)/\sqrt{N}} - \frac{N-g\sqrt{N}}{2} \right]$$

$$-2e^{g^2-y^2+2(y-2w)/\sqrt{N}}] = \frac{1}{\sqrt{\pi N}}e^{-4w^2}[1-e^{g^2-y^2}-\frac{2}{\sqrt{N}}\{2w+e^{g^2-y^2}(y-2w)\}+0(1/N)]$$

Putting $w \equiv (r-1) N^{-1/2} - \frac{1}{2} \sqrt{N}$, the highest order terms $0 (N^{-1/2})$ give, for g, u, y some fixed finite constants,

$$P_{N} \equiv P \left\{ D_{m, n}^{+} \leqslant (g - y) \sqrt{N}, \ R_{m, n} \leqslant N + u \sqrt{N} \right\}$$

$$= 2 \sum_{r=1}^{\frac{1}{2}N + \frac{1}{2}u} \frac{\sqrt{N}}{\sqrt{\pi N}} \left(1 - e^{g^{2} - y^{2}} \right) e^{-4w^{2}}$$

Since an increment of unity in r corresponds to an increment $1/\sqrt{N} = dw$ in w,

$$\lim_{N \to \infty} P_N = \frac{2}{\sqrt{\pi}} \left(1 - e^{g^2 - y^2} \right) \int_{-\infty}^{1/2} u e^{-4w^2} dw$$

$$= \frac{1}{\sqrt{\pi}} \left(1 - e^{g^2 - y^2} \right) \int_{-\infty}^{u} e^{-x^2} dx \tag{14}$$

The contribution from terms 0 (1/N) is

$$\frac{2}{N\sqrt{\pi}} \left[\sum_{r=1}^{\frac{1}{2}N+\frac{1}{2}u} \sqrt{N} e^{-4w^2} \left\{ 2(y^2w - y + w)e^{g^2 - y^2} - 2w(g^2 + 1) \right\} \right] \sim \frac{2}{\sqrt{\pi N}} \int_{-\infty}^{u} e^{-x^2} \left[(y^2 x - 2y + x)e^{g^2 - y^2} - x(1 + g^2) \right] dx$$

Since the integral is convergent, this tends to zero as $N \to \infty$. Similarly for terms of order smaller than 0 (1/N). In fact, the integrand would always be e^{-x^2} multiplied by a polynomial in x, and the integral would, therefore, be convergent; and this multiplied by a negative power of N would tend to zero. (14) shows that $R_{m,n}$ is asymptotically a normal variate not depending upon g, i.e. upon m-n; also $D_{m,n}^+$ and $R_{m,n}$ are asymptotically mutually independent.

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