

## THE $V_{NM}$ TWO-SAMPLE TEST

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**1. Summary and introduction.** The statistic  $V_{NM}$  is a two-sample statistic which may be used to test the null hypothesis  $H_0$ , that two samples, sizes  $N$  and  $M$ , come from identical populations. It is an adaptation of the Kolmogorov two-sample statistic, and is defined by

$$V_{NM} = \sup_{-\infty < x < \infty} (F_N(x) - G_M(x)) - \inf_{-\infty < x < \infty} (F_N(x) - G_M(x))$$

where  $F_N(x)$ ,  $G_M(x)$  are the sample cumulative distribution functions. A single-sample analogue  $V_N$  is defined by replacing  $G_M(x)$  in the formula above by a hypothesised distribution function  $F(x)$ . For large values of  $V_{NM}$  or  $V_N$ ,  $H_0$  will be rejected. These statistics are particularly useful for observations recorded as points on a circle; the value obtained for  $V_N$  or  $V_{NM}$ , in contrast to that of the corresponding Kolmogorov statistic, does not depend on the choice of origin. Kuiper (1960) proved this result and suggested the use of the  $V$  statistics for the circle. He also gave series approximations to the distributions of  $N^{1/2}V_N$  and  $N^{1/2}V_{NN}$ , for large  $N$ , on the null hypothesis  $H_0$ . Reference to a distribution will henceforth be assumed to refer to the distribution on the null hypothesis.

The  $V_{NN}$  statistic had earlier been investigated by Gnedenko and co-workers (see Gnedenko (1954)), who used it for observations on a line; the  $V$  statistics may be expected to be more powerful than the Kolmogorov statistics for certain alternatives. Gnedenko (1954) gives the exact distribution of  $V_{NN}$ . The exact distribution of  $V_N$ , in the upper and lower tails, has recently been given by Stephens (1965).

In this paper we make the two-sample goodness-of-fit test available for a wide range of sample sizes by giving tables of the distribution of  $V_{NM}$ . In the next section a formula is given with which the  $V_{NM}$  statistic may be calculated from the ranks of the two samples, and then the goodness-of-fit tests are set out. These are called exact or approximate tests, depending on whether the probabilities used are calculated from exact or approximate formulae. In Section 3 the construction of the tables is described. To find percentage points for large  $N$ , we develop in Section 3.3 a series expansion for the distribution of  $N^{1/2}V_{NN}$  which differs from that given by Kuiper; the probabilities given by the two expansions are compared in Table 4, and the new series clearly gives the better results.

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**2. Tests of the null hypothesis  $H_0$ .**

2.1 *Introductory notation.* The null hypothesis  $H_0$  is that the two independent random samples, respectively sizes  $N$  and  $M$ , come from the same continuous distribution function. The statistic  $V_{NM}$  is computed as below; if the observations are on a circle, any one may be chosen to begin the ranking.

Let the values in the first sample, in ascending order, be  $x_1, x_2, \dots, x_N$ , and those in the second sample, in ascending order, be  $y_1, y_2, \dots, y_M$ ; and let  $r_i$  be the rank of  $x_i$ ,  $s_j$  be the rank of  $y_j$ , in the pooled sample of the ordered  $N + M$  observations (the smallest observation having rank 1, and the largest rank  $(N + M)$ ). The formula for  $V_{NM}$  is then

$$(1) \quad V_{NM} = (MN)^{-1} \{ \max_{1 \leq i \leq N} [(N + M)i - Nr_i] + \max_{1 \leq j \leq M} [(N + M)j - Ms_j] \}.$$

When  $N = M$ , this becomes

$$(2) \quad V_{NN} = N^{-1} \{ \max_{1 \leq i \leq N} [2i - r_i] + \max_{1 \leq j \leq N} [2j - s_j] \}.$$

We now set out the goodness-of-fit tests.

2.2 *Exact test.* This is to be used when  $N \neq M$ , and  $N + M \leq 28$ ; or when  $N = M$  and  $3 \leq N \leq 100$ .

- (1) Calculate  $V_{NM}$  from (1) or (2); thus calculate either  $NMV_{NM}$ , if  $N \neq M$ , or  $NV_{NN}$ , if  $N = M$ ;
- (2) Use Table 1 or Table 2 to find  $p$  for given  $N, M$ ;
- (3) If  $p \leq \alpha$ , reject  $H_0$  at significance level  $\alpha$ .

Table 1 gives  $k$  and  $p$  such that, for unequal  $N, M$ , roughly restricted by the inequality  $N + M \leq 28$ ,  $\Pr(NMV_{NM} \geq k) = p$ . Table 2 gives  $k$  and  $p$  such that, for  $N = M$ , with values  $N = 10$  (1) 25 (5) 50 (10) 70 (5) 80 (10) 100,  $\Pr(NV_{NN} \geq k) = p$ .

2.3 *Approximate test 1.* For  $N = M$ , and  $100 \leq N \leq 500$ .

- (1) Calculate  $V_{NN}$  from (2); thus calculate  $N^{\frac{1}{2}}V_{NN}$ .
- (2) Use Table 3 to find  $y$ , the table entry for given  $\alpha, N$ .
- (3) If  $N^{\frac{1}{2}}V_{NN} \geq y$ , reject  $H_0$  at significance level  $\alpha$ .

Table 3 gives an approximate value for  $y$  for which  $\Pr(N^{\frac{1}{2}}V_{NN} \geq y) = \alpha$ , for  $\alpha = .10, .05, .025, .01$  and  $.005$ , and for  $N = 100$  (20) 300 (40) 500 and for  $1/N = 0$ .

2.4 *Approximate test 2.* For  $N \neq M$ , values not included in Table 1.

- (1) Calculate  $V_{NM}$  from (1).
- (2) Calculate  $y = [(N + M)M^{-1}]^{\frac{1}{2}}V_N(\alpha)$ , where  $V_N(\alpha)$  is the upper tail percentage point of  $V_N$ , at level  $\alpha$ , given in Stephens (1965), Table 1.
- (3) If  $V_{NM} > y$ , reject  $H_0$  at significance level  $\alpha$ .

**3. The distribution of  $V_{NM}$ .**

3.1. *Small sample sizes.* The value of  $V_{NM}$  depends on the relative ranks of the two samples. On  $H_0$ , all arrangement of the two samples, mixed together as one sample, are equally likely, and the distribution of  $V_{NM}$  may be found by calculating its value for each arrangement. This has been done to give the probabili-

ties in Table 1. As  $N$  and  $M$  increase, the number of arrangements eventually makes this technique prohibitive.

3.2. *Equal sample sizes.* We introduce

$$D_{NN}^+ = \sup_x [F_N(x) - G_N(x)] \quad \text{and} \quad D_{NN}^- = - \inf_x [F_N(x) - G_N(x)];$$

then

$$V_{NN} = D_{NN}^+ + D_{NN}^-.$$

The distribution of  $V_{NN}$  will now be derived from the joint distribution of  $D_{NN}^+$  and  $D_{NN}^-$ , given by Kemperman (1959) as follows:

$$(3) \quad P_N(a, b) = \Pr(D_{NN}^- < a/N, D_{NN}^+ < b/N) \\ = 2^{2N} \binom{2N}{N}^{-1} (2/k) \sum_{r=1}^{k-1} (\sin r\pi a/k)^2 (\cos r\pi/k)^{2N}$$

where  $a$  and  $b$  denote positive integers and  $k = a + b$ . It is easily seen that

$$(4) \quad \Pr(D_{NN}^+ + D_{NN}^- < k/N) \\ = \sum_{a=1}^k \Pr(D_{NN}^- < a/N, D_{NN}^+ = (k - a)/N) \\ = \sum_{a=1}^k P_N(a, k + 1 - a) - \sum_{a=1}^{k-1} P_N(a, k - a).$$

By substituting formula (3) into (4), interchanging the summations and using the trigonometric identity

$$\sum_{r=1}^n \cos 2rx = \frac{1}{2} [\sin (2n + 1)x / \sin x - 1]$$

we have the distribution of  $V_{NN}$ :

$$(5) \quad \Pr(V_{NN} < k/N) \\ = 2^{2N+1} \binom{2N}{N}^{-1} \left[ \sum_{s=1}^{[k/2]} (\cos s\pi(k + 1)^{-1})^{2N} - \sum_{s=1}^{[(k-1)/2]} (\cos s\pi k^{-1})^{2N} \right]$$

where  $k$  can take the values  $2, 3, \dots, N + 1$  and the symbol  $[x]$  means the greatest integer less than or equal to  $x$ .

A different expression for the distribution of  $V_{NN}$  is reported by Gnedenko (1954).

$$\Pr((\frac{1}{2}N)^{\frac{1}{2}} V_{NN} < z) = 1 + 2 \binom{2N}{N}^{-1} \left\{ a \sum_{s=1}^{[N/(a+1)]} \binom{2N}{N-s(a+1)} \right. \\ - (a - 1) \sum_{s=1}^{[N/a]} \binom{2N}{N-sa} - \sum_{i=1}^a \sum_{s=1}^{[(N+i)/(a+1)]} \binom{2N}{N+i-s(a+1)} \\ \left. + \sum_{i=1}^{a-1} \sum_{s=1}^{[(N+i)/a]} \binom{2N}{N+i-sa} \right\}$$

where  $a = [z(2N)^{\frac{1}{2}}]$ ,  $z > 0$ .

Since in fact  $V_{NN}$  takes only the values  $kN^{-1}$ ,  $k = 1, 2, \dots, N$ , it is possible to simplify this expression to

$$(6) \quad \Pr(V_{NN} \geq kN^{-1}) \\ = 2 \binom{2N}{N}^{-1} \left\{ k \sum_{s=1}^{[N/k]} \binom{2N}{N-sk} - (k + 1) \sum_{s=1}^{[N/(k+1)]} \binom{2N}{N-s(k+1)} \right\}$$

TABLE 1

*Upper tail probabilities of the distribution of  $NMV_{NM}$ .*

For given  $N, M$  and  $k$  the table shows

$$p = \Pr [V_{NM} \geq v] = \Pr [NMV_{NM} \geq k] \text{ where } v = k(NM)^{-1}$$

$$\Pr [V_{NM} > 1] = \Pr [NMV_{NM} > NM] = 0$$

$N$	$M$	$k$	$p$	$N$	$M$	$k$	$p$	$N$	$M$	$k$	$p$
3	3	9	.3000	3	18	48	.0947	4	12	32	.4044
		6	.9000			45	.1579				
						42	.2368	4	14	56	.0059
3	4	12	.2000			39	.3316			52	.0235
		9	.6000							48	.0588
				3	20	60	.0130			44	.1176
3	5	15	.1429			57	.0390			42	.1588
		12	.4286			54	.0779			40	.2353
						51	.1299			38	.3059
3	6	18	.1071			48	.1948				
		15	.3214			45	.2727	4	16	64	.0041
										60	.0165
3	7	21	.0833	4	4	16	.1143			56	.0413
		18	.2500			12	.5714			52	.0826
										48	.1734
3	8	24	.0667	4	5	20	.0714			44	.3013
		21	.2000			16	.2857				
		18	.4000					4	18	72	.0030
				4	6	24	.0476			68	.0120
3	9	27	.0545			20	.1905			64	.0300
		24	.1636			18	.3333			60	.0602
		21	.3273							56	.1053
				4	7	28	.0333			54	.1323
3	10	30	.0455			24	.1333			52	.1895
		27	.1364			21	.2667			50	.2376
		24	.2727							48	.3038
				4	8	32	.0242				
3	12	36	.0330			28	.0970	4	20	80	.0023
		33	.0989			24	.3152			76	.0090
		30	.1978							72	.0226
		27	.3297	4	9	36	.0182			68	.0452
						32	.0727			64	.0791
3	14	42	.0250			28	.1818			60	.1468
		39	.0750			27	.2545			56	.2417
		36	.1500							52	.3569
		33	.2500	4	10	40	.0140				
						36	.0559	5	5	25	.0397
3	16	48	.0196			32	.1399			20	.2778
		45	.0588			30	.2098				
		42	.1176			28	.3217	5	6	30	.0238
		39	.1961							25	.1190
		33	.2941	4	12	48	.0088			24	.1905
						44	.0352			20	.3810
3	18	54	.0158			40	.0879				
		51	.0474			36	.2198	5	7	35	.0152

TABLE 1—Continued

$N$	$M$	$k$	$p$	$N$	$M$	$k$	$p$	$N$	$M$	$k$	$p$						
5	7	30	.0758	5	16	55	.1538	6	9	39	.1349						
		28	.1364			54	.1971			36	.2547						
		25	.2576			50	.2632										
5	8	40	.0101	5	18	90	.0007	6	10	60	.0020						
		35	.0505			85	.0034			54	.0121						
		32	.1010			80	.0103			50	.0260						
		30	.1818			75	.0239			48	.0519						
		27	.3030			72	.0314			44	.0999						
						70	.0540			42	.1499						
5	9	45	.0070			67	.0745	6	12	72	.0010						
		40	.0350			65	.1073			66	.0058						
		36	.0769			62	.1442			60	.0271						
		35	.1329			60	.1880			60	.0824						
		31	.2378			57	.2427			54	.2104						
		30	.3217			55	.2973			48	.3111						
5	10	50	.0050	5	20	100	.0005	6	14	78	.0031						
		45	.0250			95	.0024			72	.0108						
		40	.0999			90	.0071			70	.0155						
		35	.2498			85	.0165			66	.0325						
		30	.5195			80	.0381			64	.0490						
						75	.0776			60	.0800						
5	12	60	.0027			70	.1388			58	.1161						
		55	.0137			65	.2235			56	.1362						
		50	.0412			60	.3534			54	.1827						
		48	.0604			6	6			36	.0130	52	.2384				
		45	.1099							30	.1169	50	.2848				
		43	.1593							24	.4416						
		40	.2335														
		38	.3159			6	7			42	.0076	6	16	90	.0018		
		36	.0455	84	.0062												
		35	.0758	80	.0094												
		30	.1742	78	.0192												
5	14	56	.0392			29	.2652			74	.0310						
		55	.0686							72	.0487						
		51	.1078			6	8			48	.0047	68	.0752				
		50	.1520							42	.0280	66	.1035				
		46	.2206							40	.0513	64	.1194				
		45	.2794							36	.1119	62	.1619				
										34	.1865	60	.2017				
										32	.2471	58	.2397				
		5	16			80	.0010					30	.3450	6	18	56	.2954
						75	.0052										
70	.0155			6	9	54	.0030	96	.0037								
65	.0361					48	.0180	90	.0119								
64	.0454					45	.0360	84	.0312								
60	.0795					42	.0749	78	.0679								
59	.1042																

TABLE 1—Continued

<i>N</i>	<i>M</i>	<i>k</i>	<i>p</i>	<i>N</i>	<i>M</i>	<i>k</i>	<i>p</i>	<i>N</i>	<i>M</i>	<i>k</i>	<i>p</i>		
6	18	72	.1382	7	10	49	.1128	7	20	91	.0937		
		66	.2473			46	.1696			86	.1178		
		60	.3918			43	.2360			85	.1469		
6	20	108	.0024	7	12	42	.2928	8	8	84	.1687		
		102	.0063			77	.0026			80	.1826		
		100	.0078			72	.0060			79	.2188		
		96	.0155			70	.0132			78	.2557		
		94	.0209			65	.0283			64	.0012		
		90	.0340			63	.0449			56	.0162		
		88	.0464			60	.0596			48	.0945		
		84	.0667			58	.0939			40	.3232		
		82	.0893			56	.1244						
		80	.0982			53	.1697			8	9	72	.0007
		78	.1267			51	.2262					64	.0056
		76	.1602			49	.2738					63	.0098
		74	.1826									56	.0280
		72	.2192			7	14			91	.0013	55	.0490
70	.2626			84	.0067	54	.0622						
7	7	49	.0041			77	.0237			48	.1084		
		42	.0449			70	.0703			47	.1615		
		35	.2162			63	.1645			46	.2070		
		28	.5833			56	.3336			45	.2350		
										40	.3196		
7	8	56	.0023	7	16	96	.0037	8	10	80	.0004		
		49	.0163			91	.0087			72	.0033		
		48	.0280			89	.0134			70	.0062		
		41	.1189			84	.0241			64	.0169		
		40	.1492			82	.0368			64	.0169		
		35	.2424			80	.0424			62	.0317		
		34	.3333			77	.0615			60	.0424		
						75	.0863			56	.0695		
						73	.1047			54	.1086		
						70	.1348			52	.1477		
7	9	56	.0098			68	.1742			50	.1748		
		54	.0182			66	.2108			48	.2246		
		49	.0448			64	.2299			46	.2904		
		47	.0797			63	.2705						
		45	.1063					8	12	84	.0027		
		42	.1622	7	20	119	.0029			80	.0068		
		40	.2350			113	.0051			76	.0144		
		38	.3077			112	.0085			72	.0318		
7	10	70	.0009			106	.0145			68	.0529		
		63	.0061			105	.0209			64	.1007		
		60	.0122			100	.0241			60	.1599		
		56	.0288			99	.0362			56	.2470		
		53	.0551			98	.0467			52	.3558		
		50	.0778			93	.0580						
						92	.0780	8	16	112	.0015		

TABLE 1—*Concluded*

$N$	$M$	$k$	$p$	$N$	$M$	$k$	$p$	$N$	$M$	$k$	$p$
8	16	104	.0062	9	9	72	.0056	10	10	70	.0699
		96	.0207			63	.0381			60	.2283
		88	.0558			54	.1573			50	.5245
		80	.1311			45	.4280				
		72	.2598							10	12
8	20	136	.0012	9	10	90	.0002			98	.0043
		132	.0020			81	.0019	96	.0057		
		128	.0037			80	.0033	90	.0106		
		124	.0062			72	.0103	88	.0187		
		120	.0108			71	.0189	86	.0268		
		116	.0166			70	.0243	84	.0317		
		112	.0276			63	.0448	80	.0441		
		108	.0389			62	.0716	78	.0645		
		104	.0610			61	.0959	76	.0875		
		100	.0843			60	.1086	74	.1079		
		96	.1215			54	.1541	72	.1203		
		92	.1633			53	.2084	70	.1450		
		88	.2173			52	.2592	68	.1826		
		84	.2805			10	10	100	.0001	66	.2253
9	9	81	.0004	10	10	90	.0018	10	10	64	.2680
						80	.0145				

where  $k$  takes the values  $1, 2, \dots, N$ . In Maag (1965) equations (5) and (6) are shown to be equivalent.

From (6), the density is found to be

$$\begin{aligned}
 \Pr(V_{NN} = kN^{-1}) &= \Pr(V_{NN} \geq kN^{-1}) - \Pr(V_{NN} \geq (k+1)N^{-1}) \\
 (7) \quad &= 2 \binom{2N}{N}^{-1} \{ k \sum_{s=1}^{\lfloor N/k \rfloor} \binom{2N}{N+sk} + (k+2) \sum_{s=1}^{\lfloor N/(k+2) \rfloor} \binom{2N}{N-s(k+2)} \\
 &\quad - 2(k+1) \sum_{s=1}^{\lfloor N/(k+1) \rfloor} \binom{2N}{N-s(k+1)} \}.
 \end{aligned}$$

The moments of  $V_{NN}$  can also be obtained:

$$\mu_r' = 2^{2N} N^{-r} \binom{2N}{N}^{-1} - N^{-r} + 2N^{-r} \binom{2N}{N}^{-1} A_N^r$$

where

$$A_N^r = \sum_{m=2}^N m(m^r + (m-2)^r - 2(m-1)^r) \sum_{s=1}^{\lfloor N/m \rfloor} \binom{2N}{N-sm}.$$

Formulas (6) and (7) have been used to construct Table 2.

3.3 *Equal sample sizes, large samples.* For large sample sizes, it becomes difficult to preserve accuracy in calculating the probabilities from the exact formulas of equations (5) or (6), so we convert them to series in powers of  $N^{-\frac{1}{2}}$ . To convert equation (5) we follow steps (a) to (d) below.

(a) We start with the power series (convergent for  $|x| < \pi/2$ )

$$\log(\cos x) = - \sum_{m=1}^{\infty} |B_{2m}| ((2m)!)^{-1} (2^{2m} - 1) 2^{2m} x^{2m} (2m)^{-1}$$

TABLE 2

*Upper tail probabilities of the distribution of  $NV_{NN}$*

For given  $N$  and  $k$  the table shows  $p = \Pr[NV_{NN} \geq k]$

$\Pr(NV_{NN} > N) = 0$

$N$	$k$	$p$	$N$	$k$	$p$	$N$	$k$	$p$
10	10	.0001	16	8	.1792	22	12	.0195
	9	.0018		7	.3733		11	.0519
	8	.0145	17	13	.0004	10	.1203	
	7	.0699		12	.0023	9	.2437	
	6	.2283		11	.0098	8	.4301	
	5	.5245		10	.0334	23	15	.0007
11	10	.0006	9	.0939	14		.0028	
	9	.0053	8	.2196	13		.0091	
	8	.0290	7	.4271	12		.0260	
	7	.1102	18	13	.0009	11	.0651	
	6	.3028		12	.0041	10	.1432	
12	11	.0002	11	.0151	24	16	.0003	
	10	.0018	10	.0465		15	.0012	
	9	.0114	9	.1200	14	.0041		
	8	.0494	8	.2614	13	.0125		
	7	.1572	19	14	.0003	12	.0336	
	6	.3772		13	.0016	11	.0798	
13	11	.0006	12	.0065	25	16	.0005	
	10	.0043	11	.0219		15	.0018	
	9	.0209	10	.0618	14	.0058		
	8	.0753	9	.1485	13	.0167		
	7	.2087	20	14	.0006	12	.0424	
	6	.4491		13	.0027	11	.0958	
14	12	.0002	12	.0099	30	18	.0003	
	11	.0016	11	.0303		17	.0011	
	10	.0084	10	.0793	16	.0032		
	9	.0339	9	.1789	15	.0088		
	8	.1062	8	.3466	14	.0219		
	7	.2630	21	15	.0002	13	.0497	
	15	12		.0006	14	.0011	12	.1026
11		.0033		13	.0043	11	.1927	
10		.0145		12	.0142	10	.3285	
9		.0505	11	.0403	35	19	.0006	
8		.1411	10	.0989		18	.0017	
7		.3183	9	.2107		17	.0045	
16		13	.0002	8		.3888	16	.0111
	12	.0012	22	15	.0004	15	.0017	
	11	.0059		14	.0018	14	.0045	
	10	.0228		13	.0064	13	.0111	
	9	.0706						



TABLE 2—Continued

$N$	$k$	$p$	$N$	$k$	$p$	$N$	$k$	$p$
35	15	.0252	60	23	.0032	80	25	.0086
	14	.0529		22	.0064		24	.0149
	13	.1028		21	.0123		23	.0251
	12	.1843		20	.0228		22	.0410
	11	.3048		19	.0405		21	.0648
40	20	.0009	70	18	.0687	90	20	.0993
	19	.0023		17	.1117		19	.1471
	18	.0055		16	.1737		18	.2107
	17	.0125		15	.2579		17	.2916
	16	.0267		27	.0007		31	.0006
	15	.0531		26	.0015		30	.0012
	14	.0988		25	.0030		29	.0021
	13	.1716		24	.0057		28	.0039
	12	.2779		23	.0106		27	.0068
	45	22		.0004	75		22	.0188
21		.0011	21	.0324		25	.0191	
20		.0027	20	.0527		24	.0368	
19		.0062	19	.0859		23	.0483	
18		.0132	18	.1323		22	.0736	
17		.0268	17	.1962		21	.1090	
16		.0513	16	.2796		20	.1568	
15		.0925	28	.0007		19	.2190	
14		.1569	27	.0014		18	.2966	
13		.2502	26	.0028		33	.0005	
50	23	.0005	80	25	.0053		32	.0010
	22	.0013		24	.0096		31	.0017
	21	.0030		23	.0168		30	.0031
	20	.0065		22	.0286		29	.0052
	19	.0133		21	.0471		28	.0087
	18	.0260		20	.0748		27	.0143
	17	.0483		19	.1148		26	.0228
	16	.0849		18	.1701		25	.0355
	15	.1414		17	.2431		24	.0540
	14	.2231		16	.3347		23	.0800
60	13	.3326		22			22	.1155
	25	.0007		29	.0007		21	.1625
	24	.0015		28	.0014		20	.2225
				27	.0026		19	.2965
			26	.0048				

TABLE 3  
Upper tail significance points of  $N^{\frac{1}{2}}V_{NN}$

$N$	$\alpha: .10$	.05	.025	.01	.005
100	2.241	2.419	2.580	2.772	2.906
120	2.245	2.424	2.584	2.778	2.913
140	2.248	2.427	2.589	2.782	2.917
160	2.251	2.430	2.592	2.786	2.921
180	2.253	2.433	2.594	2.788	2.924
200	2.255	2.435	2.597	2.791	2.926
220	2.257	2.436	2.598	2.793	2.928
240	2.258	2.438	2.600	2.794	2.930
260	2.260	2.439	2.601	2.796	2.932
280	2.261	2.440	2.603	2.797	2.933
300	2.262	2.442	2.604	2.798	2.935
340	2.263	2.443	2.606	2.801	2.937
380	2.265	2.444	2.607	2.802	2.938
420	2.266	2.446	2.609	2.804	2.940
460	2.267	2.447	2.610	2.805	2.941
500	2.268	2.448	2.611	2.806	2.942
$\infty$	2.291	2.471	2.633	2.830	2.967

where the  $B_{2m}$  are the Bernoulli numbers. With  $k = z N^{\frac{1}{2}}$ ,  $z$  bounded, we have

$$(\cos s\pi k^{-1})^{2N} = \exp[-s^2\pi^2/z^2](1 - s^4\pi^4(6Nz^4)^{-1} + O(N^{-2}))$$

and replacing  $z$  in the above formula by  $z + N^{-\frac{1}{2}}$  yields a similar expression for  $(\cos s\pi/(k + 1))^{2N}$ . We then can show

$$(8) \quad (\cos s\pi(zN^{\frac{1}{2}} + 1)^{-1})^{2N} - (\cos s\pi z^{-1}N^{-\frac{1}{2}})^{2N} \\ = \exp[-s^2\pi^2/z^2](2s^2\pi^2z^{-3}N^{-\frac{1}{2}} + N^{-1}(-3s^2\pi^2z^{-4} + 2s^4\pi^4z^{-6}) \\ + N^{-\frac{3}{2}}(4s^2\pi^2z^{-5} + 2s^4\pi^4\frac{1}{3}z^{-5} - 6s^4\pi^4z^{-7} - s^6\pi^6\frac{1}{3}z^{-7} + 4s^6\pi^6\frac{1}{3}z^{-9}) + R)$$

where the behaviour of  $R$  is discussed below.

(b) From Stirling's formula it follows that the first factor in (5) becomes

$$(9) \quad 2^{2N+1}/\binom{2N}{N} = 2(\pi N)^{\frac{1}{2}}(1 + (N8)^{-1} + O(N^{-2})).$$

Thus the product of (8) and (9) gives the typical term in (5), before summing over  $s$ , as:

$$(10) \quad \pi^{\frac{1}{2}} \exp[-s^2\pi^2/z^2] [4s^2\pi^2z^{-3} + 2N^{-\frac{1}{2}}(2s^4\pi^4z^{-6} - 3s^2\pi^2z^{-4}) + N^{-1}(s^2\pi^2\frac{1}{2}z^{-3} \\ + 8s^2\pi^2z^{-5} + 4s^4\pi^4\frac{1}{3}z^{-5} - 12s^4\pi^4z^{-7} - 2s^6\pi^6\frac{1}{3}z^{-7} + 8s^6\pi^6\frac{1}{3}z^{-9})] + A_s$$

where the remainder

$$A_s = \exp[-s^2\pi^2/z^2][R \cdot O(N^{\frac{1}{2}}) + R^*].$$

(c) We now wish to determine the order of the remainder  $A_s$  where  $s = 1, 2, \dots [(k - 1)/2]$ . From the developments which lead to (8) and (10) it is

easy to see that both  $R \cdot N^{\frac{1}{2}}$  and  $R^*$  are of order  $s^m \cdot N^{-\frac{3}{2}}$ , where  $m$  is some fixed positive number. Thus  $A_s$  is of order  $N^{-\frac{3}{2}} s^m \exp(-s^2 \pi^2 / z^2)$ .

(d) Finally the summation over  $s$  gives

$$\sum_{s=1}^{\lfloor (k-1)/2 \rfloor} A_s < \text{const. } N^{-\frac{3}{2}} \sum_{s=1}^{\infty} s^m \exp(-s^2 \pi^2 / z^2),$$

which is of order  $N^{-\frac{3}{2}}$  since the series on the right converges. We notice that for even values of  $k$  the last term in the first sum in (5), i.e.  $(\cos \frac{1}{2} k \pi (k+1))^{-1} 2^N \cdot 2^{2N} / \binom{2N}{N}$  has to be added to the remainder. Since this term decreases to zero exponentially as a function of  $N$  it does not change the order of the remainder.

Thus this sequence yields the distribution of  $N^{\frac{1}{2}} V_{NN}$  for large  $N$ :

$$\begin{aligned} \Pr(N^{\frac{1}{2}} V_{NN} < z) &= \pi^{\frac{1}{2}} \sum_{s=1}^{\infty} \exp[-s^2 \pi^2 / z^2] [4s^2 \pi^2 z^{-3} + 2N^{-\frac{1}{2}} (2s^4 \pi^4 z^{-6} - 3s^2 \pi^2 z^{-4}) \\ &+ N^{-1} (s^2 \pi^2 \frac{1}{2} z^{-3} + 8s^2 \pi^2 z^{-5} + 4s^4 \pi^4 \frac{1}{3} z^{-5} - 12s^4 \pi^4 z^{-7} \\ &- 2s^6 \pi^6 \frac{1}{3} z^{-7} + 8s^6 \pi^6 \frac{1}{3} z^{-9})] + O(N^{-\frac{3}{2}}). \end{aligned} \tag{11}$$

We may now transform (11) into a series which converges more rapidly for large values of  $z (z > \pi^{\frac{1}{2}})$ .

Let  $G(z) = \sum_{s=1}^{\infty} \exp(-s^2 \pi^2 / z^2)$ ; then it can readily be verified that (11) can be written in the form

$$\begin{aligned} \Pr(N^{\frac{1}{2}} V_{NN} < z) &= 2\pi^{\frac{1}{2}} (d/dz)G(z) + \pi^{\frac{1}{2}} N^{-\frac{1}{2}} (d^2/dz^2)G(z) \\ &+ \pi^{\frac{1}{2}} N^{-1} ((d^3/3dz^3)G(z) - z^2 (d^3/12dz^3)G(z) \\ &- 5z (d^2/12dz^2)G(z)) + O(N^{-\frac{3}{2}}). \end{aligned} \tag{12}$$

The  $\theta$ -transform applied to  $G(z)$  leads to

$$G(z) = -\frac{1}{2} + z / (2\pi^{\frac{1}{2}}) + (z\pi^{\frac{1}{2}}) \sum_{s=1}^{\infty} \exp(-s^2 z^2).$$

When this is substituted into (12), we obtain:

$$\begin{aligned} \Pr(N^{\frac{1}{2}} V_{NN} \geq z) &= \sum_{s=1}^{\infty} \exp[-s^2 z^2] [4s^2 z^2 - 2 + 2zN^{-\frac{1}{2}} (3s^2 - 2s^4 z^2) \\ &+ N^{-1} (2s^2 - 3s^2 z^2 + \frac{1}{3} s^4 z^4 - 8s^4 z^2 \\ &+ \frac{8}{3} s^6 z^4 - \frac{2}{3} s^6 z^6)] + O(N^{-\frac{3}{2}}). \end{aligned} \tag{13}$$

**3.4 Comparisons.** The probabilities given by the asymptotic formula (13) are compared with the exact probabilities, for selected values of  $N$  and  $k$ , in Table 4. For  $z \geq 2$ , only the first term in each sum in equation (13) need be used. The accuracy of (13) for  $N = 100$  also makes it of use to calculate further significance points of  $N^{\frac{1}{2}} V_{NN}$ , with high accuracy for  $N \geq 100$ . The points in Table 3 are obtained in this way.

Kuiper (1960) has also given an expansion comparable to (13). His result, with slight changes in notation, is

$$\begin{aligned} \Pr(N^{\frac{1}{2}} V_{NN} \geq z) &= \sum_{s=1}^{\infty} e^{-s^2 z^2} (4s^2 z^2 - 2) \\ &- (6N)^{-1} (1 + \sum_{s=1}^{\infty} e^{-s^2 z^2} \cdot s^2 z^2 (2s^2 z^2 - 7)) + O(N^{-2}). \end{aligned} \tag{14}$$

TABLE 4

*Comparison of exact and approximate probabilities*

For given  $N$  and  $k$ , the table gives several calculations of  $\Pr(NV_{NN} \geq k)$ : 1, the exact probability; 2, the approximate probability using (13) without the term in  $N^{-1}$ ; 3, the approximate probability using (13) including the term in  $N^{-1}$ ; 4, the approximate probability using Kuiper's series (14).

$N$	$k$	1 (exact)	2	3	4
20	8	.3466	.3292	.3494	.4327
	9	.1789	.1674	.1823	.2384
	10	.0793	.0741	.0815	.1121
	11	.0303	.0287	.0311	.0434
	12	.0099	.0098	.0099	.0113
	13	.0027	.0029	.0025	— .0017
50	13	.3326	.3257	.3335	.3890
	14	.2231	.2176	.2240	.2679
	15	.1414	.1378	.1422	.1741
	16	.0849	.0827	.0854	.1068
	18	.0260	.0257	.0262	.0332
	20	.0065	.0066	.0064	.0067
	21	.0030	.0031	.0029	.0015
22	.0013	.0014	.0013	— .0011	
100	19	.2965	.2932	.2968	.3349
	21	.1625	.1604	.1628	.1883
	23	.0800	.0790	.0801	.0948
	27	.0143	.0143	.0143	.0168
	31	.0017	.0018	.0017	.0008

The series (13) and (14) have the same first term, but differ in the terms of order  $N^{-\frac{3}{2}}$  and  $N^{-1}$ . The numerical comparison in Table 4 shows that the probabilities given by (14) are substantially different from the exact ones, and support the view that there is an error in (14).

3.5 *Larger unequal samples.* When  $N$  and  $M$  are different, the possible values of  $V_{NM}$  are multiples of  $(NM)^{-1}$ ; giving many more values than when  $N = M$ ; the probability distribution then takes smaller jumps in the tail. For values not covered by Table 1, we should like to find a good approximation to the  $\alpha$ -level significance point  $y$  for which  $\Pr(V_{NM} \geq y) \leq \alpha$ , and  $\Pr(V_{NM} > y - (NM)^{-1}) > \alpha$ . Such an approximation is given in approximate test 2, Section 2.4. It is based on the fact that, for  $N, M \rightarrow \infty$ ,  $(NM/(N + M))^{\frac{1}{2}}V_{NM}$  has the same distribution as  $N^{\frac{1}{2}}V_N$ , and exact significance points for the latter are in Stephens (1965). We have examined this approximation for the pairs:  $N = 6, M = 16$ ;  $N = 6, M = 20$ ; and  $N = 8, M = 20$ . From the values of  $y$  were calculated the exact probabilities  $\Pr(V_{NM} \geq y) = \alpha'$ , using Table 1, and values of  $\alpha'$  compared to the nominal values  $\alpha$ . For  $N = 6$ , the values of  $\alpha'$  were not always the best attainable (i.e., nearest to  $\alpha$ , but less than  $\alpha$ ), but for  $N = 8$  they were the best attainable. The approximation should improve for larger values of  $N$ .

3.6 *Further remarks.* Suppose we adapt (13) to give

$$(15) \quad \Pr((N/2)^{\frac{1}{2}}V_{NN} \geq x) \sim \sum_{s=1}^{\infty} e^{-2s^2x^2} (8s^2x^2 - 2) \\ + AN^{-\frac{1}{2}}x \sum_{s=1}^{\infty} e^{-2s^2x^2} (3s^2 - 4s^4x^2)$$

as far as the term in  $N^{-\frac{1}{2}}$ . The value of  $A$  is  $2 \cdot 2^{\frac{1}{2}}(2.828)$ . The series for the single sample statistic, given by Kuiper (1960), has for  $\Pr(N^{\frac{1}{2}}V_N \geq x)$  exactly the same opening terms, but with  $A = \frac{8}{3} = 2.667$ . One might conjecture that a series approximation for  $\Pr((NM/(N+M))^{\frac{1}{2}}V_{NM} \geq x)$  might be of the form (15) above, with  $A$  a function of  $M, N$  which, for  $M \geq N$ , decreases from  $2 \cdot 2^{\frac{1}{2}}$  when  $M = N$  to  $\frac{8}{3}$  when  $M \rightarrow \infty$ , but Hodges (1957) has shown a very erratic behaviour of the distribution of the Kolmogorov-Smirnov two-sample statistic, when  $M$  and  $N$  are different; this presumably extends to  $V_{NM}$ .

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