

## THE MOMENTS OF A DOUBLY NONCENTRAL $t$ -DISTRIBUTION

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This paper gives analytic expressions for the moments and recurrence relations for the first four raw moments of a doubly noncentral  $t$ -distribution with  $v$  degrees of freedom and noncentrality parameters  $\delta$  and  $\lambda$ . Table I provides numerical values of these moments for  $v=2$  (1) 20,  $\lambda=2$  (2) 8 (4) 20 and any suitable  $\delta$ . Two approximations to the  $t''$ -distribution, involving the moments, are considered.

### 1. INTRODUCTION

Let  $X$  be a normal variate with mean  $\delta$  and unit variance and  $Y^2$  be an independent chi-square variate with  $v$  degrees of freedom and noncentrality parameter  $\lambda$ . Then the ratio

$$t'' = X\sqrt{v}/Y \quad (1)$$

follows a doubly noncentral  $t$ -distribution with  $v$  degrees of freedom and noncentrality parameters  $\delta$  and  $\lambda$ .

Robbins [12] shows that when the population means are unequal, Student's  $t$  transforms to this  $t''$ -distribution. Patnaik [10] also considers this distribution in tests for standardised means from non-homogeneous normal populations. However, tables of the probability integral of  $t''$  are not available. These would have to be computed from double infinite series of integrals, involving three parameters  $v$ ,  $\delta$  and  $\lambda$ . Values of the moments of  $t''$  would be useful, since most approximations to this distribution would require them. This paper gives new expressions and recursion formulae for the first four raw moments of the  $t''$ -distribution. Numerical values of these moments for  $v=2$  (1) 20,  $\lambda=2$  (2) 8 (4) 20 and any suitable  $\delta$ , could be evaluated using Table I. Two approximations to the  $t''$ -distribution, making use of these moments, are considered.

When  $\lambda=0$ , we have the singly noncentral  $t$ -distribution of Johnson and Welch [6]. Tables for this distribution have been published, for instance, by Resnikoff and Lieberman [11] and Constance van Eeden [1].

When  $\delta=0$ , we have a different noncentral  $t$ -distribution defined by Marakkathavalli [8]. This is also a particular case ( $\sigma=0$ ) of the distribution considered by Robbins [12].

When  $\delta=0$ ,  $\lambda=0$ , we have Student's  $t$ .

### 2. THE $t''$ -DISTRIBUTION AND MOMENTS

The frequency function of  $X$  is

$$g(X) = \exp [-(X - \delta)^2/2]/\sqrt{2\pi},$$

that of  $Y$  is

$$h(Y) = \exp [-(Y^2 + \lambda)/2] \sum_{j=0}^{\infty} \frac{(\lambda/2)^j Y^{(v+2j-1)}}{j! 2^{(v+2j-1)} \Gamma(v/2 + j)},$$

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and hence that of  $U = X/Y$  is  $\int_0^{\infty} h(Y) g(UY) Y dY$ , which after integration, reduces to

$$\sum_{j=0}^{\infty} \sum_{i=0}^{\infty} e^{-(\lambda+2)^{1/2}} \frac{(\lambda/2)^i (\delta U \sqrt{2})^j \Gamma[(\nu + i + 1 + 2j)/2] (1 + U^2)^{-(i+1+2j)/2}}{j! i! \sqrt{\pi} \Gamma(\nu/2 + j)}.$$

Hence the probability density of  $t''$  is

$$p(t'') = \sum_{j=0}^{\infty} \sum_{i=0}^{\infty} e^{-(\lambda+2)^{1/2}} \frac{(\lambda/2)^i (\delta t'' \sqrt{2}/\sqrt{\nu})^j \Gamma[(\nu + i + 1 + 2j)/2]}{j! i! \sqrt{\nu \pi} \Gamma(\nu/2 + j) (1 + t'^{1/2}/\nu)^{(i+1+2j)/2}}. \quad (2)$$

(Robbins [12] uses  $n$ ,  $2\lambda$ ,  $\sqrt{2}\alpha$  for our  $\nu$ ,  $\lambda$ ,  $\delta$  respectively.)

Since  $X$  and  $Y$  are statistically independent,

$$E[(t'')^k] = \nu^{k/2} E(X^k) \cdot E(Y^{-k}).$$

Now

$$\begin{aligned} E(X^k) &= \int_{-\infty}^{\infty} e^{-(X-k)^2/2} \frac{X^k}{\sqrt{2\pi}} dX = \int_{-\infty}^{\infty} e^{-t^2/2} \frac{(t+\delta)^k dt}{\sqrt{2\pi}} \\ &= \frac{1}{\sqrt{\pi}} \sum_{r \in E} \binom{k}{r} 2^{r/2} \delta^{k-r} \Gamma\left(\frac{r+1}{2}\right) \end{aligned}$$

where

$$E = \{r : r \text{ even} \leq k\},$$

and

$$\begin{aligned} E(Y^{-k}) &= \int_0^{\infty} e^{-(Y^2+\lambda)/2} \sum_{j=0}^{\infty} \frac{(\lambda/2)^j Y^{r-k+2j-1} dY}{j! 2^{r/2} \Gamma(\nu/2 + j)} \\ &= \sum_{j=0}^{\infty} \sigma^{-k/2} \frac{(\lambda/2)^j \Gamma\left(\frac{\nu-k}{2} + j\right)}{j! 2^{k/2} \Gamma(\nu/2 + j)} \\ &= \Gamma\left(\frac{\nu-k}{2}\right) H\left(\frac{\nu-k}{2}, \frac{\nu}{2}; -\frac{\lambda}{2}\right) \cdot e^{-\lambda/2} / 2^{k/2} \Gamma(\nu/2), \end{aligned}$$

where the hypergeometric function

$$H(a, b; x) = \frac{\Gamma(b)}{\Gamma(a)} \sum_{j=0}^{\infty} \frac{\Gamma(a+j)x^j}{\Gamma(b+j)j!}.$$

Using Kummer's formula ([13], page 6)

$$e^{-x} H(a, b; x) = H(b-a, b; -x),$$

$$E(Y^{-k}) = \Gamma\left(\frac{\nu-k}{2}\right) H(k/2, \nu/2; -\lambda/2) / 2^{k/2} \Gamma(\nu/2), \quad (\nu > k).$$

Hence the  $k$ th raw moment of  $t''$

$$m_k(t''/\nu, \delta, \lambda) = (\nu/2)^{k/2} \Gamma\left(\frac{\nu - k}{2}\right) \frac{H(k/2, \nu/2; -\lambda/2)}{\Gamma(\nu/2) \sqrt{\pi}} \\ \sum_{r \in E} \binom{k}{r} 2^r \nu^{k-r} \Gamma\left(\frac{r+1}{2}\right), \quad (3)$$

where

$$E = \{r : r \text{ even} \leq k\} \quad (\nu > k).$$

Making appropriate substitutions for  $k$  in (3), we have for the first four raw moments of  $t''$ :

$$m_1 = \delta \sqrt{(\nu/2)} \Gamma\left(\frac{\nu - 1}{2}\right) H(1/2, \nu/2; -\lambda/2) / \Gamma(\nu/2), \quad (\nu > 1), \quad (4)$$

$$m_2 = [\delta^2 \Gamma(1/2) + 2\Gamma(3/2)] (\nu/2) \Gamma\left(\frac{\nu - 2}{2}\right) H(1, \nu/2; -\lambda/2) / \sqrt{\pi} \Gamma(\nu/2) \\ = (\delta^2 + 1) \nu H(1, \nu/2; -\lambda/2) / (\nu - 2), \quad (\nu > 2), \quad (5)$$

$$m_3 = [\delta^3 \Gamma(1/2) + 6\delta \Gamma(3/2)] \Gamma\left(\frac{\nu - 3}{2}\right) H(3/2, \nu/2; -\lambda/2) (\nu/2)^{1/2} / \sqrt{\pi} \Gamma(\nu/2) \\ = \delta(\delta^2 + 3)(\nu/2)^{1/2} H(3/2, \nu/2; -\lambda/2) \Gamma\left(\frac{\nu - 3}{2}\right) / \Gamma(\nu/2), \quad (\nu > 3), \quad (6)$$

and

$$m_4 = [\delta^4 \Gamma(1/2 + 12\delta^3 \Gamma(3/2) + 4\Gamma(5/2)] \\ \cdot (\nu/2)^2 \Gamma\left(\frac{\nu - 4}{2}\right) H(2, \nu/2; -\lambda/2) / \sqrt{\pi} \Gamma(\nu/2) \\ = (\delta^4 + 6\delta^2 + 3)\nu^2 H(2, \nu/2; -\lambda/2) / (\nu - 2)(\nu - 4), \quad (\nu > 4). \quad (7)$$

## 2. RECURRENCE RELATIONS FOR MOMENTS

Recursion relations in the moments as functions of  $\nu$ , help in their numerical evaluation. Following are forward recursion formulas for the first four raw moments of  $t''$ :

$$m_1(\nu) = \sqrt{\nu} \left[ \left( 1 - \frac{\nu - 4}{\lambda} \right) \frac{m_1(\nu - 2)}{\sqrt{\nu - 2}} + \frac{(\nu - 5)m_1(\nu - 4)}{\lambda \sqrt{\nu - 4}} \right], \quad (\nu > 5) \quad (8)$$

$$m_2(\nu) = \frac{\nu}{\lambda} [(\delta^2 + 1) - (\nu - 4)m_1(\nu - 2)/(\nu - 2)], \quad (\nu > 4) \quad (9)$$

$$m_3(\nu) = (\delta^2 + 3)\nu^{1/2} [m_1(\nu - 2)/\sqrt{\nu - 2} - m_1(\nu)/\sqrt{\nu}], \quad (\nu > 3) \quad (10)$$

$$m_4(\nu) = (\delta^4 + 6\delta^2 + 3)\nu^2 [m_1(\nu - 2)/(\nu - 2) - m_1(\nu)/\nu] / 2(\delta^2 + 1), \quad (\nu > 4). \quad (11)$$

where  $m_k(\nu)$  stands for the  $k$ th moment of  $t''$  with  $\nu$  degrees of freedom, and parameters  $\delta$  and  $\lambda$ .

These relations can be derived using the following identities in the hypergeometric functions: (see page 19, [13])

$$b(b-1)H(a, b-1; z) - b(b-1+x)H(a, b; z) + (b-a)xH(a, b+1; z) = 0, \\ \text{with } a = 1/2, b = \nu/2 - 1, x = -\lambda/2$$

for formula (8),

$$bH(a, b; z) - bH(a-1, b; z) - xH(a, b+1; z) = 0, \\ \text{with } a = 1, b = \nu/2 - 1, x = -\lambda/2, \text{ for (9)}$$

and

$$(1+a-b)H(a, b; z) - aH(a+1, b; z) + (b-1)H(a, b-1; z) = 0$$

with

$$a = 1/2, b = \nu/2, x = -\lambda/2 \quad \text{for (10)} \quad \text{and} \quad a = 1, b = \nu/2, x = -\lambda/2 \\ \text{for (11).}$$

#### 4. LIMITING CASE

Using the formula (Bateman, [2], page 47)

$$\Gamma(z) = e^{-z} e^{(z-1/2) \log z} \sqrt{2z} [1 + 1/12z + 1/288z^2 + O(1/z^3)]$$

and expressing the Gamma and Hypergeometric functions in powers of  $(1/\nu)$ , we get

$$\begin{aligned} m_1 &= \delta \left[ 1 + \frac{1}{\nu} (3/4 - \lambda/2) + O(1/\nu^2) \right], \\ m_2 &= (\delta^2 + 1) \left[ 1 + (2 - \lambda)/\nu + O(1/\nu^2) \right], \\ m_3 &= \delta(\delta^2 + 3) \left[ 1 + \frac{3}{\nu} (5/4 - \lambda/2) + O(1/\nu^2) \right], \\ m_4 &= (\delta^4 + 6\delta^2 + 3) \left[ 1 + (6 - 2\lambda)/\nu + O(1/\nu^2) \right]. \end{aligned} \quad (12)$$

When  $\nu \rightarrow \infty$ , the first four raw moments of  $t''$  tend to

$$\delta, (\delta^2 + 1), \delta(\delta^2 + 3), (\delta^4 + 6\delta^2 + 3) \text{ respectively, } (\lambda, \delta, \text{finite}).$$

The first four central moments of  $t''$  therefore tend to those of a normal variate with mean  $\delta$  and unit variance.

When  $\lambda \rightarrow \infty$  ( $\nu, \delta, \text{finite}$ ), the moments tend to zero, since

$$\lim_{x \rightarrow \infty} e^{-x} H(a, b; x) = 0, (b > a), \text{ (page 60), [13].}$$

#### 5. TABLE OF MOMENTS-COMPUTATIONAL PROCEDURES

The moments of the  $t'$ -distribution could be evaluated using tables of the hypergeometric and gamma functions. However, existing tables for  $H(a, b; x)$  are for restricted small values of  $a, b$  and positive  $x$ : for example, the ranges of  $a, b$ , and  $x$  are  $(-1, 1), (0, 1), (0, 10)$  or  $(-11, 2), (-4, 1)$ , 1 in [13], and

TABLE I

r	$\lambda=2$				$\lambda=4$			
	$C_1$	$C_2$	$C_3$	$C_4$	$C_1$	$C_2$	$C_3$	$C_4$
2	.143985				.824537			
3	.023903	1.814538			.826982			
4	.004476	1.864541	2.440549		.844370	.864664	1.292964	
5	.994384	1.154801	1.090210	2.838990	.860728	.880007	1.03135	1.874900
6	.001125	1.103638	1.406026	2.787170	.874606	.881501	.857421	.330486
7	.985252	1.074917	1.318103	1.860215	.885461	.857492	.927306	1.153813
8	.087537	1.050964	1.246197	1.585813	.895530	.864604	.914051	1.082082
9	.087537	1.044008	1.190728	1.817077	.903455	.871887	.908274	1.037710
10	.087444	1.030383	1.165374	1.424111	.910068	.878753	.906818	1.010386
11	.087703	1.030114	1.142258	1.384785	.918637	.888129	.906412	.962810
12	.985040	1.023580	1.123808	1.306785	.921884	.860901	.907537	.981078
13	.985419	1.016564	1.108343	1.272333	.926517	.886300	.909480	.973058
14	.985797	1.018730	1.097712	1.342953	.930050	.901275	.911877	.987499
15	.985180	1.016361	1.088179	1.216816	.931304	.903778	.916228	.985625
16	.985015	1.015861	1.082850	1.208905	.932450	.905205	.917452	.985453
17	.985015	1.015286	1.073433	1.180995	.945598	.813714	.918380	.985966
18	.985057	1.011451	1.067802	1.167907	.943205	.917320	.911199	.987377
19	.985584	1.010302	1.063854	1.155740	.947870	.929481	.925401	.987115
20	.990696	1.000318	1.058543	1.145153	.948548	.923464	.925703	.956694
r	$\lambda=6$				$\lambda=8$			
	$C_1$	$C_2$	$C_3$	$C_4$	$C_1$	$C_2$	$C_3$	$C_4$
2	.651269				.645818			
3	.696900	.680634			.609507	.462010		
4	.735034	.633475	.743938		.656457	.490842	.487431	
5	.784847	.658187	.675820	.982251	.692369	.530831	.471371	.586299
6	.788115	.683202	.734446	.800581	.721384	.566834	.485854	.510687
7	.807981	.703646	.858367	.734120	.744945	.596313	.521948	.531974
8	.833109	.725689	.945705	.740100	.764630	.622710	.546816	.527473
9	.836475	.743817	.796225	.788184	.781784	.548618	.509678	.545013
10	.847895	.759180	.723477	.747523	.791784	.578405	.500205	.559060
11	.852895	.774095	.740270	.747745	.805354	.584327	.510245	.571315
12	.866408	.785311	.748995	.754230	.819417	.705049	.527854	.585407
13	.874151	.795367	.750700	.761758	.826237	.711419	.549381	.586443
14	.880956	.806336	.769337	.776008	.838015	.728365	.558792	.622594
15	.887046	.815377	.778694	.778310	.845914	.740387	.673433	.633683
16	.892350	.823606	.787759	.783303	.853265	.751373	.680020	.649354
17	.897326	.831129	.795980	.790700	.859162	.761458	.696498	.660059
18	.902057	.838004	.803436	.796703	.865501	.770733	.707533	.671053
19	.906199	.844393	.810462	.802903	.870930	.779300	.717481	.581369
20	.910000	.850209	.817016	.808704	.875967	.787388	.727708	.691216

(0, 100), 1, (0, .1) in [9]. Although recursive relations aid in evaluating  $H(a, b; z)$  for untabulated values of the arguments, they could hardly be used for the moments of  $t''$ , which might involve large values of  $b$  and negative  $z$ . We have therefore tabulated the first four moments of  $t''$ . To simplify tabulation with results not involving  $\delta$ , the following transformations were made:

$$\begin{aligned}
 c_1 &= m_1/\delta, \\
 c_2 &= m_2/(\delta^2 + 1), \\
 c_3 &= m_3/(\delta^3 + 3), \\
 c_4 &= m_4/(\delta^4 + 6\delta^2 + 3).
 \end{aligned} \tag{13}$$

TABLE I (continued)

	$\lambda = 12$				$\lambda = 16$			
	$C_1$	$C_2$	$C_3$	$C_4$	$C_1$	$C_2$	$C_3$	$C_4$
2	.430706				.366901			
3	.499733	.280570			.423285	.202797		
4	.551241	.332507	.231480		.483409	.249016	.141829	
5	.591769	.377688	.269571	.224796	.524082	.291375	.174494	.116440
6	.624775	.416873	.302127	.246662	.567829	.328140	.205785	.140200
7	.652360	.451138	.334731	.271737	.586508	.361013	.235153	.164189
8	.675845	.481389	.364803	.297765	.611293	.390619	.262657	.187804
9	.696138	.506318	.392110	.322727	.632996	.417449	.288374	.210199
10	.713885		.417335	.343631	.652202	.441886	.312443	.231888
11	.720559	.554258	.440556	.368530	.669349	.464280	.334093	.252617
12	.743521	.574028	.462004	.389677	.684772	.484861	.356150	.272487
13	.756048	.592024	.481862	.406276	.698734	.503858	.376028	.291433
14	.767350	.608554	.500299	.427810	.711443	.521454	.394733	.309520
15	.777828	.627870	.517402	.442265	.723070	.537804	.412383	.326788
16	.786099	.637809	.533476	.461721	.733752	.553038	.429003	.343278
17	.795367	.650803	.548464	.477265	.743606	.567272	.444732	.359033
18	.803480	.662875	.562403	.491038	.752727	.580602	.459632	.374092
19	.810786	.674122	.575678	.505830	.761108	.593115	.473736	.388485
20	.817547	.684858	.588086	.518996	.769087	.604888	.487134	.402278
#	$\lambda = 20$							
	$C_1$	$C_2$	$C_3$	$C_4$				
2	.328317							
3	.387295	.169112						
4	.435543	.199990	.008102					
5	.475000	.238740	.124978	.071118				
6	.506239	.270001	.161017	.080955				
7	.536864	.302084	.176007	.109033				
8	.561902	.327999	.196879	.128008				
9	.584033	.353479	.222827	.146700				
10	.603798	.377000	.244278	.164007				
11	.621593	.396760	.268478	.182830				
12	.637722	.419039	.284467	.200181				
13	.652426	.437919	.303111	.219066				
14	.665900	.456550	.320981	.232230				
15	.678300	.472091	.337771	.248978				
16	.689759	.487615	.353892	.264192				
17	.700384	.502228	.369272	.278801				
18	.710268	.516002	.383058	.293089				
19	.719491	.520016	.397093	.306803				
20	.728118	.541331	.411416	.320048				

Then the recurrence relations become

$$\begin{aligned}
 c_1(\nu) &= \nu^{1/2} [(1 - (\nu - 4)/\lambda)c_1(\nu - 2)/\sqrt{\nu - 2}) \\
 &\quad + (\nu - 5)/\lambda)c_1(\nu - 4)/\sqrt{\nu - 4}], \quad (\nu > 5) \\
 c_2(\nu) &= (\nu/\lambda)[1 - ((\nu - 4)/(\nu - 2))c_2(\nu - 2)], \quad (\nu > 4) \\
 c_3(\nu) &= \nu^{1/2}[c_1(\nu - 2)/\sqrt{\nu - 2} - c_1(\nu)/\sqrt{\nu}], \quad (\nu > 3), \\
 c_4(\nu) &= \nu^2[c_1(\nu - 2)/(\nu - 2) - c_1(\nu)/\nu]/2, \quad (\nu > 4),
 \end{aligned} \tag{14}$$

and depend only on  $\nu$  and  $\lambda$ . Table I gives the results for  $c_i$  ( $i=1, 2, 3, 4$ ) for  $\nu=2$  (1) 20,  $\lambda=2$  (2) 20. The first four raw moments of  $t''$  could easily

be obtained from corresponding values of the  $c$ 's, for any value of  $\delta$  and the tabulated values of  $v$  and  $\lambda$ , from (13).

When  $\delta=0$ ,  $m_1$  and  $m_2$  become zero.

Values for the case  $\lambda=0$  have been given by Hogben, Pinkham and Wilk [5], and have not been included here.

When  $v=\infty$ ,  $c_i \rightarrow 1$ ; when  $\lambda \rightarrow \infty$ ,  $c_i \rightarrow 0$ ;  $i=1, 2, 3, 4$ .

$c_1, c_2, c_3$  are defined only for  $v \geq 3, 4, 5$  respectively; undefined values have been left blank in Table I.

All computations were performed on the IBM 1620 using a modulus of 5 and a mantissa of 28. Two runs were necessary to obtain the results. The first run was used to calculate  $c_i$  for  $v=2, 3, 4, 5$  and  $c_i$  for  $v=3, 4$  and  $\lambda=2$  (2) 8 (4) 20 using formulae (13). The second run used these values in the recurrence formulae (14) to get  $c_i$ ,  $i=1$  to 4, for higher values of  $v$ . The final answers were truncated to 8 decimal places. 11 terms ( $\lambda=2$ ) to 40 terms ( $\lambda=20$ ) of the hypergeometric function were used for the initial values of the moments ( $v=2, 3, 4, 5$ ) to give numerical accuracy to about 28 decimal places. This was necessary, since errors in the last decimal place tended to shift to the left as  $v$  increased in formulae (14), giving accuracy to only about 7 decimal places for  $v$  near 20. Four-point Lagrangian interpolation in  $\lambda$  could be used in Table I to get moments for intermediate values of  $\lambda$ . The moments for larger degrees of freedom, say  $v=22$  (2) 50, could be obtained using the recursive formulae.

#### 6. APPROXIMATIONS TO THE $t''$ -DISTRIBUTION BY (1) A MODIFIED $t$ -DISTRIBUTION, (2) A SINGLY NONCENTRAL $t$ .

The first approximation to the  $t''$ -distribution is by that of a transformed correlation coefficient, following Harley's method [4] for the singly noncentral  $t$ . Suppose then, we approximate the distribution of  $t''$  by that of

$$w = r\sqrt{(n-2)} h(\rho)/\sqrt{(1-r^2)} \quad (15)$$

where  $r$  is the correlation coefficient in a sample of size  $n$  drawn randomly from a bivariate normal population with correlation  $\rho$ , and  $h(\rho)$  is a function of  $\rho$  to be determined suitably, (see [7]).

The first three moments of  $w$  when  $\rho \neq 0$  are (see [4])

$$\begin{aligned} m_1(w) &= (n-2)^{1/2} \rho h(\rho) / [(n-3)\sqrt{(1-\rho^2)}], \\ m_2(w) &= (n-2)[1 + (n-1)\rho^2/(1-\rho^2)](h(\rho))^2 / (n-4), \\ m_3(w) &= (n-2)^{1/2} \rho [3 + n\rho^2/(1-\rho^2)](h(\rho))^3 / [(n-3)(n-5)\sqrt{(1-\rho^2)}]. \end{aligned} \quad (16)$$

To bring the distribution of  $r/\sqrt{(1-r^2)}$  and  $t''$  into correspondence, we have to specify a form for  $h(\rho)$  and to relate  $n$  and  $\rho$  to  $v$ ,  $\delta$  and  $\lambda$ . The link could be made in a number of ways: the method chosen below, following Harley's in [4], was partly because it led to simple relations which did not involve any approximations to the gamma functions, while providing satisfactory results in a few numerical comparisons.

Here, the ratio of the moments  $m_3(w)/m_1(w)$  are equated to the ratio  $m_4(t'')/m_2(t'')$ , and the values of  $m_3(w)$ , to  $m_4(t'')$ .

From (16),

$$\frac{m_3(w)}{m_1(w)} = \langle h(\rho) \rangle^4 \frac{(n-2)}{(n-5)} \left( 3 + \frac{n\rho^4}{(1-\rho^2)} \right)$$

while from (6) and (4),

$$\frac{m_2(t'')}{m_1(t'')} = \frac{\nu(\delta^2 + 3)}{(\nu - 3)} \frac{H(3/2, \nu/2; -\lambda/2)}{H(1/2, \nu/2; -\lambda/2)}.$$

Equating these moment ratios, as also the second moments in (16) and (5), we get

$$h^4(\rho) \frac{(n-2)}{(n-5)} [3 + n\rho^4/(1-\rho^2)] = \frac{\nu}{(\nu-3)} (\delta^2 + 3) \frac{H(3/2, \nu/2; -\lambda/2)}{H(1/2, \nu/2; -\lambda/2)}, \quad (17)$$

and

$$h^2(\rho) \frac{(n-2)}{(n-4)} \left[ 1 + \frac{(n-1)}{(1-\rho^2)} \rho^2 \right] = \frac{\nu}{(\nu-2)} (\delta^2 + 1) H(1, \nu/2; -\lambda/2).$$

If we choose  $\nu = n-2$  or

$$n = \nu + 2 \quad (18)$$

a result which gives exact correspondence when  $\rho=0$  and  $\delta=\lambda=0$ , we have on solving the equations in (17),

$$\begin{aligned} \rho &= [(3K - L)/\{(n-2)L - (n-3)K\}]^{1/2}, \\ h(\rho) &= [K/(1 + (n-1)\rho^2/(1-\rho^2))]^{1/2} \end{aligned} \quad (19)$$

where

$$\begin{aligned} L &= (\delta^2 + 3)H(3/2, n/2 - 1; -\lambda/2)/H(1/2, n/2 - 1; -\lambda/2) \\ &= (n-5)m_2(t''/(n-2), \delta, \lambda)/[(n-2)m_1(t''/(n-2), \delta, \lambda)] \end{aligned} \quad (20)$$

and

$$K = (\delta^2 + 1)H(1, n/2 - 1; -\lambda/2) = (n-4)m_2(t''/(n-2), \delta, \lambda)/(n-2).$$

$n, \rho, h(\rho)$  can be obtained from the tabulated moments of  $t''$  in Table I.

In the second approximation to  $t''$ , considered by Patnaik [10], the first two moments of  $t''$  are equated to the corresponding moments of  $ct'$ , where  $t'$  is a singly noncentral  $t$  with  $f$  degrees of freedom and noncentrality parameter  $\delta$ ,  $c$  being a scale factor. He obtains

$$\begin{aligned} c(\delta^2/2)^{1/2} \sqrt{f} \Gamma(f-1)/2]/\Gamma(f/2) &= m_1(t'') = (\delta^2/2)^{1/2} g, \\ c^2(1+\delta^2)f/(f-2) &= m_2(t'') = (1+\delta^2)h, \end{aligned} \quad (21)$$

and employing Stirling's approximation to the gamma function, gets

$$\begin{aligned} 1/f &= 2[-1 + \sqrt{(15 - 7\delta^2/h)}/7, \\ c &= \sqrt[h(1 - 2/f)]. \end{aligned} \quad (22)$$

Here again,  $c$  and  $f$  can be obtained using the values of the moments in Table I.

## 7. EVALUATION OF THE PROBABILITY INTEGRAL OF $\Gamma^{\alpha}$

Using (2), the probability integral  $\int_{0-\infty}^{\infty} p(t''/\nu, \delta, \lambda) dt''$  can be put in the form

$$\frac{1}{2} \sum_{j=2}^{\infty} \sum_{r=0}^{\infty} r^{-k/2} \frac{(\lambda/2)^j}{j!} e^{-t^2/2} \frac{(\delta^2/2)^{r/2}}{\Gamma(r/2 + 1)} \left\{ \begin{array}{l} ((r+1)/2, (\nu/2 + j)) \\ (a^2/(\nu + a^2)) \end{array} \right\} + (1 -)^r \quad (23)$$

and although the incomplete beta functions  $I_x(p, q)$  are each less than one, and the Poisson terms get smaller and smaller after a certain stage, calculation of the double infinite series of integrals involving three parameters  $\nu$ ,  $\delta$ , and  $\lambda$ , is tedious.

When  $t^r$  is approximated by  $\sqrt{(n-2)} \cdot rh(\rho) / \sqrt{1-r^2}$ , the above probability integral is approximately given by

$$\Pr(\sqrt{(n-2)r}h(\rho)/\sqrt{(1-r^2)} \leq a) = \Pr(r \leq a/\sqrt{a^2 + (n-2)h^2(\rho)}) = \int_{-1}^a p_a(r/\rho) dr$$

where

$$r_1 = a/\sqrt{a^2 + (n-2)h^2(\rho)}$$

and  $n$ ,  $\rho$ ,  $b(\rho)$  are defined as in (18), (10), in terms of  $\nu$ ,  $\delta$ ,  $\lambda$ , or the first three moments of  $t''$ . Using David's tables [3] giving the probability integral of  $r$  in samples of size  $n$  from a bivariate normal population with correlation  $\rho$ , and interpolating in the arguments  $n$ ,  $\rho$ ,  $r_0$ , the approximate value of the probability integral of  $t''$  can be obtained. Four-point Lagrangian interpolation may be used.

Using the second approximation to  $t''$  by  $c t'$ , the approximate value of  $\Pr(t'' \leq a)$  is  $\Pr(t' \leq a/c)$ , where  $c$  and the degrees of freedom  $f$  of  $t'$  are defined in (22). This probability can be obtained from tables of  $t'$ , [11] or by approximate methods as in [1] or [4].

A few exact values of  $f_{\nu-\nu}^{\nu-\nu} p(t'/\nu, \delta, \lambda) dt''$  have been evaluated and shown in Table II, along with their approximate values.

TABLE II. SHOWING EXACT AND APPROXIMATE VALUES OF

$$\int \mathbf{P}(t''/v, \delta, \lambda) dt''$$

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