

HYBRID PERMUTATION TEST WITH APPLICATION TO SURFACE SHAPE ANALYSIS

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Supplementary Material

Appendix 1.

Derivation of the Third and Fourth Moments for Mean Difference Test Statistics

The third moment: $U = U^{(1,1,1)} \cup U^{(1,2)} \cup U^{(3)}$

$$\begin{aligned} a_{(1,1,1)} &= \left(\binom{n_1}{3} \frac{1}{n_1^3} - \binom{n_2}{3} \frac{1}{n_2^3} - \binom{n_1}{2} \binom{n_2}{1} \frac{1}{n_1^2 n_2} + \binom{n_1}{1} \binom{n_2}{2} \frac{1}{n_1 n_2^2} \right) / \binom{n_1+n_2}{3} \\ &= \frac{2(n_2 - n_1)}{(n_1^2 n_2^2 (n_1 + n_2 - 1)(n_1 + n_2 - 2))}; \end{aligned}$$

$$\begin{aligned} a_{(1,2)} &= \left(\binom{n_1}{2} \frac{1}{n_1^3} - \binom{n_2}{2} \frac{1}{n_2^3} - \binom{n_1}{1} \binom{n_2}{1} \frac{1/2}{n_1^2 n_2} + \binom{n_1}{1} \binom{n_2}{1} \frac{1/2}{n_1 n_2^2} \right) / \binom{n_1+n_2}{2} \\ &= \frac{(n_1 - n_2)}{(n_1^2 n_2^2 (n_1 + n_2 - 1))}; \end{aligned}$$

$$a_{(3)} = \left(\binom{n_1}{1} \frac{1}{n_1^3} - \binom{n_2}{1} \frac{1}{n_2^3} \right) / \binom{n_1+n_2}{3} = \frac{(n_1 - n_2)}{(n_1^2 n_2^2)};$$

The fourth moment: $U = U^{(1,1,1,1)} \cup U^{(1,1,2)} \cup U^{(1,3)} \cup U^{(2,2)} \cup U^{(4)}$

$$\begin{aligned} a_{(1,1,1,1)} &= \left(\binom{n_1}{4} \frac{1}{n_1^4} - \binom{n_1}{3} \binom{n_2}{1} \frac{1}{n_1^3 n_2} + \binom{n_1}{2} \binom{n_2}{2} \frac{1}{n_1^2 n_2^2} \right. \\ &\quad \left. - \binom{n_1}{1} \binom{n_2}{3} \frac{1}{n_1 n_2^3} + \binom{n_2}{4} \frac{1}{n_2^4} \right) / \binom{n_1+n_2}{4}; \end{aligned}$$

$$\begin{aligned} a_{(1,1,2)} &= \left(\binom{n_1}{3} \frac{1}{n_1^4} - \frac{2}{3} \binom{n_1}{2} \binom{n_2}{1} \frac{1}{n_1^3 n_2} + \frac{1}{3} \binom{n_1}{2} \binom{n_2}{1} \frac{1}{n_1^2 n_2^2} \right. \\ &\quad \left. + \frac{1}{3} \binom{n_1}{1} \binom{n_2}{2} \frac{1}{n_1 n_2^2} - \frac{2}{3} \binom{n_1}{1} \binom{n_2}{2} \frac{1}{n_1 n_2^3} + \binom{n_2}{3} \frac{1}{n_2^4} \right) / \binom{n_1+n_2}{3}; \end{aligned}$$

$$a_{(1,3)} = \left(\binom{n_1}{2} \frac{1}{n_1^4} - \frac{1}{2} \binom{n_1}{1} \binom{n_2}{1} \frac{1}{n_1^3 n_2} - \frac{1}{2} \binom{n_1}{1} \binom{n_2}{1} \frac{1}{n_1 n_2^3} + \binom{n_2}{2} \frac{1}{n_2^4} \right) / \binom{n_1+n_2}{2};$$

$$a_{(2,2)} = \left(\binom{n_1}{2} \frac{1}{n_1^4} + \binom{n_1}{1} \binom{n_2}{1} \frac{1}{n_1^2 n_2^2} + \binom{n_2}{2} \frac{1}{n_2^4} \right) / \binom{n_1+n_2}{2};$$

$$a_{(4)} = \left(\binom{n_1}{1} \frac{1}{n_1^4} + \binom{n_2}{1} \frac{1}{n_2^4} \right) / \binom{n_1+n_2}{1};$$

Appendix 2.

Derivation of the Third and Fourth Moments for Modified Hotelling's T^2 Test Statistics

The third moment: $U = U^{(1,1,1,1,1,1)} \cup U^{(1,1,1,1,2)} \cup U^{(1,1,1,3)} \cup U^{(1,1,2,2)} \cup U^{(1,1,4)} \cup U^{(1,2,3)} \cup U^{(2,2,2)} \cup U^{(1,5)} \cup U^{(2,4)} \cup U^{(3,3)} \cup U^{(6)}$;

$$a_{(1,1,1,1,1,1)} = \left(\binom{n_1}{6} \frac{1}{n_1^6} - \binom{n_1}{5} \binom{n_2}{1} \frac{1}{n_1^5 n_2} + \binom{n_1}{4} \binom{n_2}{2} \frac{1}{n_1^4 n_2^2} - \binom{n_1}{3} \binom{n_2}{3} \frac{1}{n_1^3 n_2^3} \right. \\ \left. + \binom{n_1}{2} \binom{n_2}{4} \frac{1}{n_1^2 n_2^4} - \binom{n_1}{1} \binom{n_2}{5} \frac{1}{n_1 n_2^5} + \binom{n_2}{6} \frac{1}{n_2^6} \right) / \binom{n_1+n_2}{6};$$

$$a_{(1,1,1,1,2)} = \left(\binom{n_1}{5} \frac{1}{n_1^6} - \frac{4}{5} \binom{n_1}{4} \binom{n_2}{1} \frac{1}{n_1^5 n_2} + \frac{1}{5} \binom{n_1}{4} \binom{n_2}{2} \frac{1}{n_1^4 n_2^2} + \frac{3}{5} \binom{n_1}{3} \binom{n_2}{2} \frac{1}{n_1^3 n_2^2} \right. \\ \left. - \frac{2}{5} \binom{n_1}{3} \binom{n_2}{2} \frac{1}{n_1^3 n_2^3} - \frac{2}{5} \binom{n_1}{2} \binom{n_2}{3} \frac{1}{n_1^2 n_2^3} + \frac{3}{5} \binom{n_1}{2} \binom{n_2}{3} \frac{1}{n_1^2 n_2^4} \right. \\ \left. + \frac{1}{5} \binom{n_1}{1} \binom{n_2}{4} \frac{1}{n_1 n_2^4} - \frac{4}{5} \binom{n_1}{1} \binom{n_2}{4} \frac{1}{n_1 n_2^5} + \binom{n_2}{5} \frac{1}{n_2^6} \right) / \binom{n_1+n_2}{5};$$

$$a_{(1,1,1,3)} = \left(\binom{n_1}{4} \frac{1}{n_1^6} - \frac{3}{4} \binom{n_1}{3} \binom{n_2}{1} \frac{1}{n_1^5 n_2} - \frac{1}{4} \binom{n_1}{3} \binom{n_2}{2} \frac{1}{n_1^3 n_2^3} + \frac{1}{2} \binom{n_1}{2} \binom{n_2}{2} \frac{1}{n_1^4 n_2^2} \right. \\ \left. + \frac{1}{2} \binom{n_1}{2} \binom{n_2}{2} \frac{1}{n_1^2 n_2^4} - \frac{1}{4} \binom{n_1}{1} \binom{n_2}{3} \frac{1}{n_1 n_2^3} - \frac{3}{4} \binom{n_1}{1} \binom{n_2}{3} \frac{1}{n_1 n_2^5} \right. \\ \left. + \binom{n_2}{4} \frac{1}{n_2^6} \right) / \binom{n_1+n_2}{4};$$

$$a_{(1,1,2,2)} = \left(\binom{n_1}{4} \frac{1}{n_1^6} - \frac{1}{2} \binom{n_1}{3} \binom{n_2}{1} \frac{1}{n_1^5 n_2} + \frac{1}{2} \binom{n_1}{3} \binom{n_2}{2} \frac{1}{n_1^4 n_2^2} + \frac{1}{6} \binom{n_1}{2} \binom{n_2}{2} \frac{1}{n_1^4 n_2^2} \right. \\ \left. - \frac{2}{3} \binom{n_1}{2} \binom{n_2}{2} \frac{1}{n_1^3 n_2^3} + \frac{1}{6} \binom{n_1}{2} \binom{n_2}{2} \frac{1}{n_1^2 n_2^4} + \frac{1}{2} \binom{n_1}{1} \binom{n_2}{3} \frac{1}{n_1^2 n_2^4} \right. \\ \left. - \frac{1}{2} \binom{n_1}{1} \binom{n_2}{3} \frac{1}{n_1 n_2^5} + \binom{n_2}{4} \frac{1}{n_2^6} \right) / \binom{n_1+n_2}{4};$$

$$a_{(1,1,4)} = \left(\binom{n_1}{3} \frac{1}{n_1^6} - \frac{2}{3} \binom{n_1}{2} \binom{n_2}{1} \frac{1}{n_1^5 n_2} + \frac{1}{3} \binom{n_1}{2} \binom{n_2}{2} \frac{1}{n_1^2 n_2^4} \right. \\ \left. + \frac{1}{3} \binom{n_1}{1} \binom{n_2}{2} \frac{1}{n_1 n_2^2} - \frac{2}{3} \binom{n_1}{1} \binom{n_2}{2} \frac{1}{n_1 n_2^5} + \binom{n_2}{3} \frac{1}{n_2^6} \right) / \binom{n_1+n_2}{3};$$

$$a_{(1,2,3)} = \left(\binom{n_1}{3} \frac{1}{n_1^6} - \frac{1}{3} \binom{n_1}{2} \binom{n_2}{1} \frac{1}{n_1^5 n_2^1} + \frac{1}{3} \binom{n_1}{2} \binom{n_2}{1} \frac{1}{n_1^4 n_2^2} - \frac{1}{3} \binom{n_1}{2} \binom{n_2}{1} \frac{1}{n_1^3 n_2^3} \right. \\ \left. - \frac{1}{3} \binom{n_1}{1} \binom{n_2}{2} \frac{1}{n_1^3 n_2^3} + \frac{1}{3} \binom{n_1}{1} \binom{n_2}{2} \frac{1}{n_1^2 n_2^4} - \frac{1}{3} \binom{n_1}{1} \binom{n_2}{2} \frac{1}{n_1 n_2^5} \right. \\ \left. + \binom{n_2}{3} \frac{1}{n_2^6} \right) / \binom{n_1+n_2}{3};$$

$$a_{(2,2,2)} = \left(\binom{n_1}{3} \frac{1}{n_1^6} - \binom{n_1}{2} \binom{n_2}{1} \frac{1}{n_1^4 n_2^2} + \binom{n_1}{1} \binom{n_2}{2} \frac{1}{n_1^2 n_2^4} + \binom{n_2}{3} \frac{1}{n_2^6} \right) / \binom{n_1+n_2}{3};$$

$$a_{(1,5)} = \left(\binom{n_1}{2} \frac{1}{n_1^6} - \frac{1}{2} \binom{n_1}{1} \binom{n_2}{1} \frac{1}{n_1^5 n_2^1} - \frac{1}{2} \binom{n_1}{1} \binom{n_2}{1} \frac{1}{n_1 n_2^5} + \binom{n_2}{2} \frac{1}{n_2^6} \right) / \binom{n_1+n_2}{2};$$

$$a_{(2,4)} = \left(\binom{n_1}{2} \frac{1}{n_1^6} + \frac{1}{2} \binom{n_1}{1} \binom{n_2}{1} \frac{1}{n_1^4 n_2^2} + \frac{1}{2} \binom{n_1}{1} \binom{n_2}{1} \frac{1}{n_1^2 n_2^4} + \binom{n_2}{2} \frac{1}{n_2^6} \right) / \binom{n_1+n_2}{2};$$

$$a_{(3,3)} = \left(\binom{n_1}{2} \frac{1}{n_1^6} - \binom{n_1}{1} \binom{n_2}{1} \frac{1}{n_1^3 n_2^3} + \binom{n_2}{2} \frac{1}{n_2^6} \right) / \binom{n_1+n_2}{2};$$

$$a_{(6)} = \left(\binom{n_1}{1} \frac{1}{n_1^6} + \binom{n_2}{2} \frac{1}{n_2^6} \right) / \binom{n_1+n_2}{1};$$

The fourth moment: $U = U^{(1,1,1,1,1,1,1,1)} \cup U^{(1,1,1,1,1,1,1,2)} \cup U^{(1,1,1,1,1,1,3)} \cup U^{(1,1,1,1,2,2)} \cup U^{(1,1,1,1,4)} \cup U^{(1,1,1,2,3)} \cup U^{(1,1,2,2,2)} \cup U^{(2,2,2,2)} \cup U^{(1,1,1,5)} \cup U^{(1,1,2,4)} \cup U^{(1,1,3,3)} \cup U^{(1,2,2,3)} \cup U^{(1,1,6)} \cup U^{(1,2,5)} \cup U^{(1,3,4)} \cup U^{(2,2,4)} \cup U^{(2,3,3)} \cup U^{(1,7)} \cup U^{(2,6)} \cup U^{(3,5)} \cup U^{(4,4)} \cup U^{(8)}$

$$a_{(1,1,1,1,1,1,1,1)} = \left(\binom{n_1}{8} \frac{1}{n_1^8} - \binom{n_1}{7} \binom{n_2}{1} \frac{1}{n_1^7 n_2^1} + \binom{n_1}{6} \binom{n_2}{2} \frac{1}{n_1^6 n_2^2} - \binom{n_1}{5} \binom{n_2}{3} \frac{1}{n_1^5 n_2^3} \right. \\ \left. + \binom{n_1}{4} \binom{n_2}{4} \frac{1}{n_1^4 n_2^4} - \binom{n_1}{3} \binom{n_2}{5} \frac{1}{n_1^3 n_2^5} + \binom{n_1}{2} \binom{n_2}{6} \frac{1}{n_1^2 n_2^6} \right. \\ \left. - \binom{n_1}{1} \binom{n_2}{7} \frac{1}{n_1 n_2^7} + \binom{n_2}{8} \frac{1}{n_2^8} \right) / \binom{n_1+n_2}{8};$$

$$a_{(1,1,1,1,1,1,1,2)} = \left(\binom{n_1}{7} \frac{1}{n_1^8} - \frac{6}{7} \binom{n_1}{6} \binom{n_2}{1} \frac{1}{n_1^7 n_2^1} + \frac{1}{7} \binom{n_1}{6} \binom{n_2}{2} \frac{1}{n_1^6 n_2^2} \right. \\ \left. + \frac{5}{7} \binom{n_1}{5} \binom{n_2}{2} \frac{1}{n_1^6 n_2^2} - \frac{2}{7} \binom{n_1}{5} \binom{n_2}{2} \frac{1}{n_1^5 n_2^3} - \frac{4}{7} \binom{n_1}{4} \binom{n_2}{3} \frac{1}{n_1^5 n_2^3} \right. \\ \left. + \frac{3}{7} \binom{n_1}{4} \binom{n_2}{3} \frac{1}{n_1^4 n_2^4} + \frac{3}{7} \binom{n_1}{3} \binom{n_2}{4} \frac{1}{n_1^4 n_2^4} - \frac{4}{7} \binom{n_1}{3} \binom{n_2}{4} \frac{1}{n_1^3 n_2^5} \right. \\ \left. - \frac{2}{7} \binom{n_1}{2} \binom{n_2}{5} \frac{1}{n_1^3 n_2^5} + \frac{5}{7} \binom{n_1}{2} \binom{n_2}{5} \frac{1}{n_1^2 n_2^6} + \frac{1}{7} \binom{n_1}{1} \binom{n_2}{6} \frac{1}{n_1 n_2^6} \right. \\ \left. - \frac{6}{7} \binom{n_1}{1} \binom{n_2}{6} \frac{1}{n_1 n_2^7} + \binom{n_2}{7} \frac{1}{n_2^8} \right) / \binom{n_1+n_2}{7};$$

$$\begin{aligned}
a_{(1,1,1,1,1,3)} &= \left(\binom{n_1}{6} \frac{1}{n_1^8} - \frac{5}{6} \binom{n_1}{5} \binom{n_2}{1} \frac{1}{n_1^7 n_2^1} - \frac{1}{6} \binom{n_1}{5} \binom{n_2}{1} \frac{1}{n_1^5 n_2^3} + \frac{4}{6} \binom{n_1}{4} \binom{n_2}{2} \frac{1}{n_1^6 n_2^2} \right. \\
&\quad + \frac{2}{6} \binom{n_1}{4} \binom{n_2}{2} \frac{1}{n_1^4 n_2^4} - \frac{3}{6} \binom{n_1}{3} \binom{n_2}{3} \frac{1}{n_1^5 n_2^3} - \frac{3}{6} \binom{n_1}{3} \binom{n_2}{3} \frac{1}{n_1^3 n_2^5} \\
&\quad + \frac{2}{6} \binom{n_1}{2} \binom{n_2}{4} \frac{1}{n_1^4 n_2^4} + \frac{4}{6} \binom{n_1}{2} \binom{n_2}{4} \frac{1}{n_1^2 n_2^6} - \frac{1}{6} \binom{n_1}{1} \binom{n_2}{5} \frac{1}{n_1^3 n_2^5} \\
&\quad \left. - \frac{5}{6} \binom{n_1}{1} \binom{n_2}{5} \frac{1}{n_1 n_2^7} + \binom{n_2}{6} \frac{1}{n_2^8} \right) / \binom{n_1+n_2}{6};
\end{aligned}$$

$$\begin{aligned}
a_{(1,1,1,1,2,2)} &= \left(\binom{n_1}{6} \frac{1}{n_1^8} - \frac{4}{6} \binom{n_1}{5} \binom{n_2}{1} \frac{1}{n_1^7 n_2^1} + \frac{2}{6} \binom{n_1}{5} \binom{n_2}{1} \frac{1}{n_1^6 n_2^2} \right. \\
&\quad + \frac{6}{15} \binom{n_1}{4} \binom{n_2}{2} \frac{1}{n_1^6 n_2^2} - \frac{8}{15} \binom{n_1}{4} \binom{n_2}{2} \frac{1}{n_1^5 n_2^3} + \frac{1}{15} \binom{n_1}{4} \binom{n_2}{2} \frac{1}{n_1^4 n_2^4} \\
&\quad - \frac{4}{20} \binom{n_1}{3} \binom{n_2}{3} \frac{1}{n_1^5 n_2^3} + \frac{12}{20} \binom{n_1}{3} \binom{n_2}{3} \frac{1}{n_1^4 n_2^4} - \frac{4}{20} \binom{n_1}{3} \binom{n_2}{3} \frac{1}{n_1^3 n_2^5} \\
&\quad + \frac{1}{15} \binom{n_1}{2} \binom{n_2}{4} \frac{1}{n_1^4 n_2^4} - \frac{8}{15} \binom{n_1}{2} \binom{n_2}{4} \frac{1}{n_1^3 n_2^5} + \frac{6}{15} \binom{n_1}{2} \binom{n_2}{4} \frac{1}{n_1^2 n_2^6} \\
&\quad \left. + \frac{2}{6} \binom{n_1}{1} \binom{n_2}{5} \frac{1}{n_1 n_2^6} - \frac{4}{6} \binom{n_1}{1} \binom{n_2}{5} \frac{1}{n_1 n_2^7} + \binom{n_2}{6} \frac{1}{n_2^8} \right) / \binom{n_1+n_2}{6};
\end{aligned}$$

$$\begin{aligned}
a_{(1,1,1,1,4)} &= \left(\binom{n_1}{5} \frac{1}{n_1^8} - \frac{4}{5} \binom{n_1}{4} \binom{n_2}{1} \frac{1}{n_1^7 n_2^1} + \frac{1}{5} \binom{n_1}{4} \binom{n_2}{1} \frac{1}{n_1^4 n_2^4} \right. \\
&\quad + \frac{3}{5} \binom{n_1}{3} \binom{n_2}{2} \frac{1}{n_1^6 n_2^2} - \frac{2}{5} \binom{n_1}{3} \binom{n_2}{2} \frac{1}{n_1^3 n_2^5} - \frac{2}{5} \binom{n_1}{3} \binom{n_2}{2} \frac{1}{n_1^5 n_2^3} \\
&\quad + \frac{3}{5} \binom{n_1}{2} \binom{n_2}{3} \frac{1}{n_1^2 n_2^6} + \frac{1}{5} \binom{n_1}{1} \binom{n_2}{4} \frac{1}{n_1^4 n_2^4} - \frac{4}{5} \binom{n_1}{1} \binom{n_2}{4} \frac{1}{n_1 n_2^7} \\
&\quad \left. + \binom{n_2}{5} \frac{1}{n_2^8} \right) / \binom{n_1+n_2}{5};
\end{aligned}$$

$$\begin{aligned}
a_{(1,1,1,2,3)} &= \left(\binom{n_1}{5} \frac{1}{n_1^8} - \frac{3}{5} \binom{n_1}{4} \binom{n_2}{1} \frac{1}{n_1^7 n_2^1} + \frac{1}{5} \binom{n_1}{4} \binom{n_2}{1} \frac{1}{n_1^6 n_2^2} \right. \\
&\quad - \frac{1}{5} \binom{n_1}{4} \binom{n_2}{1} \frac{1}{n_1^5 n_2^3} + \frac{3}{10} \binom{n_1}{3} \binom{n_2}{2} \frac{1}{n_1^6 n_2^2} - \frac{3}{10} \binom{n_1}{3} \binom{n_2}{2} \frac{1}{n_1^5 n_2^3} \\
&\quad + \frac{3}{10} \binom{n_1}{3} \binom{n_2}{2} \frac{1}{n_1^4 n_2^4} - \frac{1}{10} \binom{n_1}{3} \binom{n_2}{2} \frac{1}{n_1^3 n_2^5} - \frac{1}{10} \binom{n_1}{2} \binom{n_2}{3} \frac{1}{n_1^5 n_2^3} \\
&\quad + \frac{3}{10} \binom{n_1}{2} \binom{n_2}{3} \frac{1}{n_1^4 n_2^4} - \frac{3}{10} \binom{n_1}{2} \binom{n_2}{3} \frac{1}{n_1^3 n_2^5} + \frac{3}{10} \binom{n_1}{2} \binom{n_2}{3} \frac{1}{n_1^2 n_2^6} \\
&\quad - \frac{1}{5} \binom{n_1}{1} \binom{n_2}{4} \frac{1}{n_1^3 n_2^5} - \frac{1}{5} \binom{n_1}{1} \binom{n_2}{4} \frac{1}{n_1^3 n_2^5} + \frac{1}{5} \binom{n_1}{1} \binom{n_2}{4} \frac{1}{n_1^2 n_2^6} \\
&\quad \left. - \frac{3}{5} \binom{n_1}{1} \binom{n_2}{4} \frac{1}{n_1 n_2^7} + \binom{n_2}{5} \frac{1}{n_2^8} \right) / \binom{n_1+n_2}{5};
\end{aligned}$$

$$\begin{aligned}
a_{(1,1,2,2,2)} &= \left(\binom{n_1}{5} \frac{1}{n_1^8} - \frac{2}{5} \binom{n_1}{4} \binom{n_2}{1} \frac{1}{n_1^7 n_2} + \frac{3}{5} \binom{n_1}{4} \binom{n_2}{1} \frac{1}{n_1^6 n_2^2} \right. \\
&\quad + \frac{1}{10} \binom{n_1}{3} \binom{n_2}{2} \frac{1}{n_1^6 n_2^2} - \frac{6}{10} \binom{n_1}{3} \binom{n_2}{2} \frac{1}{n_1^5 n_2^3} + \frac{3}{10} \binom{n_1}{3} \binom{n_2}{2} \frac{1}{n_1^4 n_2^4} \\
&\quad + \frac{3}{10} \binom{n_1}{2} \binom{n_2}{3} \frac{1}{n_1^4 n_2^4} - \frac{6}{10} \binom{n_1}{2} \binom{n_2}{3} \frac{1}{n_1^3 n_2^5} + \frac{1}{10} \binom{n_1}{2} \binom{n_2}{3} \frac{1}{n_1^2 n_2^6} \\
&\quad \left. + \frac{3}{5} \binom{n_1}{1} \binom{n_2}{4} \frac{1}{n_1^2 n_2^6} - \frac{2}{5} \binom{n_1}{1} \binom{n_2}{4} \frac{1}{n_1 n_2^7} + \binom{n_2}{5} \frac{1}{n_2^8} \right) / \binom{n_1+n_2}{5};
\end{aligned}$$

$$\begin{aligned}
a_{(2,2,2,2)} &= \left(\binom{n_1}{4} \frac{1}{n_1^8} + \binom{n_1}{3} \binom{n_2}{1} \frac{1}{n_1^6 n_2^2} + \binom{n_1}{2} \binom{n_2}{2} \frac{1}{n_1^4 n_2^4} \right. \\
&\quad \left. + \binom{n_1}{1} \binom{n_2}{3} \frac{1}{n_1^2 n_2^6} + \binom{n_2}{4} \frac{1}{n_2^8} \right) / \binom{n_1+n_2}{4};
\end{aligned}$$

$$\begin{aligned}
a_{(1,1,1,5)} &= \left(\binom{n_1}{4} \frac{1}{n_1^8} - \frac{3}{4} \binom{n_1}{3} \binom{n_2}{1} \frac{1}{n_1^7 n_2} - \frac{1}{4} \binom{n_1}{3} \binom{n_2}{1} \frac{1}{n_1^3 n_2^5} \right. \\
&\quad + \frac{1}{2} \binom{n_1}{2} \binom{n_2}{2} \frac{1}{n_1^6 n_2^2} + \frac{1}{2} \binom{n_1}{2} \binom{n_2}{2} \frac{1}{n_1^2 n_2^6} - \frac{1}{4} \binom{n_1}{1} \binom{n_2}{3} \frac{1}{n_1^3 n_2^3} \\
&\quad \left. - \frac{3}{4} \binom{n_1}{1} \binom{n_2}{3} \frac{1}{n_1 n_2^7} + \binom{n_2}{4} \frac{1}{n_2^8} \right) / \binom{n_1+n_2}{4};
\end{aligned}$$

$$\begin{aligned}
a_{(1,1,2,4)} &= \left(\binom{n_1}{4} \frac{1}{n_1^8} - \frac{1}{2} \binom{n_1}{3} \binom{n_2}{1} \frac{1}{n_1^7 n_2} + \frac{1}{4} \binom{n_1}{3} \binom{n_2}{1} \frac{1}{n_1^6 n_2^2} \right. \\
&\quad + \frac{1}{4} \binom{n_1}{3} \binom{n_2}{1} \frac{1}{n_1^4 n_2^4} + \frac{1}{6} \binom{n_1}{2} \binom{n_2}{2} \frac{1}{n_1^6 n_2^2} - \frac{1}{3} \binom{n_1}{2} \binom{n_2}{2} \frac{1}{n_1^5 n_2^3} \\
&\quad - \frac{1}{3} \binom{n_1}{2} \binom{n_2}{2} \frac{1}{n_1^3 n_2^5} + \frac{1}{6} \binom{n_1}{2} \binom{n_2}{2} \frac{1}{n_1^2 n_2^6} + \frac{1}{4} \binom{n_1}{1} \binom{n_2}{3} \frac{1}{n_1^4 n_2^4} \\
&\quad \left. + \frac{1}{4} \binom{n_1}{1} \binom{n_2}{3} \frac{1}{n_1^2 n_2^6} - \frac{1}{2} \binom{n_1}{1} \binom{n_2}{3} \frac{1}{n_1 n_2^7} + \binom{n_2}{4} \frac{1}{n_2^8} \right) / \binom{n_1+n_2}{4};
\end{aligned}$$

$$\begin{aligned}
a_{(1,1,3,3)} &= \left(\binom{n_1}{4} \frac{1}{n_1^8} - \frac{1}{2} \binom{n_1}{3} \binom{n_2}{1} \frac{1}{n_1^7 n_2} - \frac{1}{2} \binom{n_1}{3} \binom{n_2}{1} \frac{1}{n_1^5 n_2^3} + \frac{1}{6} \binom{n_1}{2} \binom{n_2}{2} \frac{1}{n_1^6 n_2^2} \right. \\
&\quad + \frac{2}{3} \binom{n_1}{2} \binom{n_2}{2} \frac{1}{n_1^4 n_2^4} + \frac{1}{6} \binom{n_1}{2} \binom{n_2}{2} \frac{1}{n_1^2 n_2^6} - \frac{1}{2} \binom{n_1}{1} \binom{n_2}{3} \frac{1}{n_1^3 n_2^5} \\
&\quad \left. - \frac{1}{2} \binom{n_1}{1} \binom{n_2}{3} \frac{1}{n_1 n_2^7} + \binom{n_2}{4} \frac{1}{n_2^8} \right) / \binom{n_1+n_2}{4};
\end{aligned}$$

$$\begin{aligned}
a_{(1,2,2,3)} &= \left(\binom{n_1}{4} \frac{1}{n_1^8} - \frac{1}{4} \binom{n_1}{3} \binom{n_2}{1} \frac{1}{n_1^7 n_2} + \frac{1}{2} \binom{n_1}{3} \binom{n_2}{1} \frac{1}{n_1^6 n_2^2} \right. \\
&\quad \left. - \frac{1}{4} \binom{n_1}{3} \binom{n_2}{1} \frac{1}{n_1^5 n_2^3} - \frac{1}{3} \binom{n_1}{2} \binom{n_2}{2} \frac{1}{n_1^5 n_2^3} + \frac{1}{3} \binom{n_1}{2} \binom{n_2}{2} \frac{1}{n_1^4 n_2^4} \right)
\end{aligned}$$

$$-\frac{1}{3} \binom{n_1}{2} \binom{n_2}{2} \frac{1}{n_1^3 n_2^5} - \frac{1}{4} \binom{n_1}{1} \binom{n_2}{2} \frac{1}{n_1^3 n_2^5} + \frac{1}{2} \binom{n_1}{1} \binom{n_2}{3} \frac{1}{n_1^2 n_2^6} \\ - \frac{1}{4} \binom{n_1}{1} \binom{n_2}{3} \frac{1}{n_1 n_2^7} + \binom{n_2}{4} \frac{1}{n_2^8} \Big/ \binom{n_1+n_2}{4};$$

$$a_{(1,1,6)} = \left(\binom{n_1}{3} \frac{1}{n_1^8} - \frac{2}{3} \binom{n_1}{2} \binom{n_2}{1} \frac{1}{n_1^7 n_2^1} + \frac{1}{3} \binom{n_1}{2} \binom{n_2}{1} \frac{1}{n_1^2 n_2^6} + \frac{1}{3} \binom{n_1}{1} \binom{n_2}{2} \frac{1}{n_1^6 n_2^2} \right. \\ \left. - \frac{2}{3} \binom{n_1}{1} \binom{n_2}{2} \frac{1}{n_1 n_2^7} + \binom{n_2}{3} \frac{1}{n_2^8} \right) \Big/ \binom{n_1+n_2}{3};$$

$$a_{(1,2,5)} = \left(\binom{n_1}{3} \frac{1}{n_1^8} - \frac{1}{3} \binom{n_1}{2} \binom{n_2}{1} \frac{1}{n_1^7 n_2^1} + \frac{1}{3} \binom{n_1}{2} \binom{n_2}{1} \frac{1}{n_1^6 n_2^2} - \frac{1}{3} \binom{n_1}{2} \binom{n_2}{1} \frac{1}{n_1^3 n_2^5} \right. \\ \left. - \frac{1}{3} \binom{n_1}{1} \binom{n_2}{2} \frac{1}{n_1^5 n_2^3} + \frac{1}{3} \binom{n_1}{1} \binom{n_2}{2} \frac{1}{n_1^2 n_2^6} - \frac{1}{3} \binom{n_1}{1} \binom{n_2}{2} \frac{1}{n_1 n_2^7} \right. \\ \left. + \binom{n_2}{3} \frac{1}{n_2^8} \right) \Big/ \binom{n_1+n_2}{3};$$

$$a_{(1,3,4)} = \left(\binom{n_1}{3} \frac{1}{n_1^8} - \frac{1}{3} \binom{n_1}{2} \binom{n_2}{1} \frac{1}{n_1^7 n_2^1} - \frac{1}{3} \binom{n_1}{2} \binom{n_2}{1} \frac{1}{n_1^5 n_2^3} + \frac{1}{3} \binom{n_1}{2} \binom{n_2}{1} \frac{1}{n_1^4 n_2^4} \right. \\ \left. + \frac{1}{3} \binom{n_1}{1} \binom{n_2}{2} \frac{1}{n_1^4 n_2^4} - \frac{1}{3} \binom{n_1}{1} \binom{n_2}{2} \frac{1}{n_1^3 n_2^5} - \frac{1}{3} \binom{n_1}{1} \binom{n_2}{2} \frac{1}{n_1 n_2^7} \right. \\ \left. + \binom{n_2}{3} \frac{1}{n_2^8} \right) \Big/ \binom{n_1+n_2}{3};$$

$$a_{(2,2,4)} = \left(\binom{n_1}{3} \frac{1}{n_1^8} + \frac{2}{3} \binom{n_1}{2} \binom{n_2}{1} \frac{1}{n_1^6 n_2^2} + \frac{1}{3} \binom{n_1}{2} \binom{n_2}{1} \frac{1}{n_1^4 n_2^4} + \frac{1}{3} \binom{n_1}{1} \binom{n_2}{2} \frac{1}{n_1^4 n_2^4} \right. \\ \left. + \frac{2}{3} \binom{n_1}{1} \binom{n_2}{2} \frac{1}{n_1^2 n_2^6} + \binom{n_2}{2} \frac{1}{n_2^8} \right) \Big/ \binom{n_1+n_2}{3};$$

$$a_{(2,3,3)} = \left(\binom{n_1}{3} \frac{1}{n_1^8} + \frac{1}{3} \binom{n_1}{2} \binom{n_2}{1} \frac{1}{n_1^6 n_2^2} - \frac{2}{3} \binom{n_1}{2} \binom{n_2}{1} \frac{1}{n_1^5 n_2^3} - \frac{2}{3} \binom{n_1}{1} \binom{n_2}{2} \frac{1}{n_1^3 n_2^5} \right. \\ \left. + \frac{1}{3} \binom{n_1}{1} \binom{n_2}{2} \frac{1}{n_1^2 n_2^6} + \binom{n_2}{2} \frac{1}{n_2^8} \right) \Big/ \binom{n_1+n_2}{3};$$

$$a_{(1,7)} = \left(\binom{n_1}{2} \frac{1}{n_1^8} - \frac{1}{2} \binom{n_1}{1} \binom{n_2}{1} \frac{1}{n_1^7 n_2^1} - \frac{1}{2} \binom{n_1}{1} \binom{n_2}{1} \frac{1}{n_1 n_2^7} + \binom{n_2}{2} \frac{1}{n_2^8} \right) \Big/ \binom{n_1+n_2}{2};$$

$$a_{(2,6)} = \left(\binom{n_1}{2} \frac{1}{n_1^8} + \frac{1}{2} \binom{n_1}{1} \binom{n_2}{1} \frac{1}{n_1^6 n_2^2} + \frac{1}{2} \binom{n_1}{1} \binom{n_2}{1} \frac{1}{n_1^2 n_2^6} + \binom{n_2}{2} \frac{1}{n_2^8} \right) \Big/ \binom{n_1+n_2}{2};$$

$$a_{(3,5)} = \left(\binom{n_1}{2} \frac{1}{n_1^8} - \frac{1}{2} \binom{n_1}{1} \binom{n_2}{1} \frac{1}{n_1^5 n_2^3} - \frac{1}{2} \binom{n_1}{1} \binom{n_2}{1} \frac{1}{n_1^3 n_2^5} + \binom{n_2}{2} \frac{1}{n_2^8} \right) \Big/ \binom{n_1+n_2}{2};$$

$$a_{(4,4)} = \left(\binom{n_1}{2} \frac{1}{n_1^8} + \binom{n_1}{1} \binom{n_2}{1} \frac{1}{n_1^4 n_2^4} + \binom{n_2}{2} \frac{1}{n_2^8} \right) / \binom{n_1+n_2}{2};$$

$$a_{(8)} = \left(\binom{n_1}{2} \frac{1}{n_1^8} + \binom{n_2}{1} \frac{1}{n_2^8} \right) / \binom{n_1+n_2}{2};$$

Appendix 3.

Matlab Code (Simulated Data for Mean Difference Test Statistics)

Usage: >> ComparePerm_MeanDiff

```
%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%ComparePerm_MeanDiff.m%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
```

```
% Compare the efficiency and accuracy of our hybrid pemutation
% with random permutation and exact permutation. We generate six different
% simulated data sets to evaluate our hybrid permutation approach.
```

```
% Test Statistic: mean difference
```

```
% Author: Chunxiao Zhou
% Email: czhou4@uiuc.edu
% Revision Date: 2007/12/10
```

```
% References:
% Chunxiao Zhou and Yongmei Michelle Wang (2008)
% Hybrid Permutation Test With Application To Surface Shape Analysis,
% Statistica Sinica.
```

```
% set number of random permutation
num_rp = 20000;
```

```
%----- Case 1: Normal Distribution (balanced) -----
% initialize sample size
n1 = 10; n2 = 10; n = n1+n2;
% initialize moments coefficient
[Coef_3rd, Coef_4th] = MomentsCoef_MeanDiff(n, n1);
% generate random two-group samples
Data_A1 = normrnd(0,1,1,n1); Data_B1 = normrnd(1,0.5,1,n2); Data1 =
[Data_A1 Data_B1];
% exact permutaion
[Pval_ep1, t_ep1, mean_diff1] = ExactPerm_MeanDiff(Data1, n, n1);
% random permutation
[Pval_rp1, t_rp1] = RandPerm_MeanDiff(Data1, n, n1, num_rp);
% hybrid permutation
[Pval_hp1, fitcdf1, t_hp1]=HybridPerm_MeanDiff(Data1, n,
```

```

n1,Coef_3rd,Coef_4th,mean_diff1);
% display comparison results;
disp('For case 1, the p-value estimations');
disp(sprintf('exact permutation Pval_ep1=%f',Pval_ep1));
disp(sprintf('random permutation Pval_rp1=%f',Pval_rp1));
disp(sprintf('hybrid permutation Pval_hp1=%f',Pval_hp1));
disp('For case 1, the computation costs (in seconds)');
disp(sprintf('exact permutation t_ep1=%f',t_ep1));
disp(sprintf('random permutation t_rp1=%f',t_rp1));
disp(sprintf('hybrid permutation t_hp1=%f',t_hp1));
disp(' ');
% display fitted Pearson distribution and exact permutation distribution
[Stat1, Ind1] = sort(mean_diff1); x1 = Stat1; y1 =fitcdf1(Ind1);
figure, mycdfplot(mean_diff1);hold on;
plot(Stat1,fitcdf1(Ind1),'--b','LineWidth',3);
legend('true','fitted',2); hold off;

%----- Case 2: Normal Distribution (unbalanced) -----
% initialize sample size
n1 = 6; n2 = 18; n = n1+n2;
% initialize moments coefficient
[Coef_3rd, Coef_4th] = MomentsCoef_MeanDiff(n, n1);
% generate random two-group samples
Data_A2 = normrnd(0,1,1,n1); Data_B2 = normrnd(1,0.5,1,n2); Data2 =
[Data_A2 Data_B2];
% exact permutaion
[Pval_ep2, t_ep2, mean_diff2] = ExactPerm_MeanDiff(Data2, n, n1);
% random permutation
[Pval_rp2, t_rp2] = RandPerm_MeanDiff(Data2, n, n1, num_rp);
% hybrid permutation
[Pval_hp2, fitcdf2, t_hp2]=HybridPerm_MeanDiff(Data2, n,
n1,Coef_3rd,Coef_4th,mean_diff2);
% display comparison results;
disp('For case 2, the p-value estimations');
disp(sprintf('exact permutation Pval_ep2=%f',Pval_ep2));
disp(sprintf('random permutation Pval_rp2=%f',Pval_rp2));
disp(sprintf('hybrid permutation Pval_hp2=%f',Pval_hp2));
disp('For case 2, the computation costs (in seconds)');
disp(sprintf('exact permutation t_ep2=%f',t_ep2));
disp(sprintf('random permutation t_rp2=%f',t_rp2));
disp(sprintf('hybrid permutation t_hp2=%f',t_hp2));
disp(' ');
% display fitted Pearson distribution and exact permutation distribution
[Stat2, Ind2] = sort(mean_diff2); x2 = Stat2; y2 =fitcdf2(Ind2);
figure, mycdfplot(mean_diff2);hold on;

```



```

plot(Stat2,fitcdf2(Ind2),'--b','LineWidth',3);
legend('true','fitted',2); hold off;

%----- Case 3: Gama Distribution (balanced) -----
% initialize sample size
n1 = 10; n2 = 10; n = n1+n2;
% initialize moments coefficient
[Coef_3rd, Coef_4th] = MomentsCoef_MeanDiff(n, n1);
% generate random two-group samples
Data_A3 = gamrnd(3,3,1,n1); Data_B3 = gamrnd(3,2,1,n2); Data3 =
[Data_A3 Data_B3];
% exact permutaion
[Pval_ep3, t_ep3, mean_diff3] = ExactPerm_MeanDiff(Data3, n, n1);
% random permutation
[Pval_rp3, t_rp3] = RandPerm_MeanDiff(Data3, n, n1, num_rp);
% hybrid permutation
[Pval_hp3, fitcdf3, t_hp3]=HybridPerm_MeanDiff(Data3, n,
n1,Coef_3rd,Coef_4th,mean_diff3);
% display comparison results;
disp('For case 3, the p-value estimations');
disp(sprintf('exact permutation Pval_ep3=%f',Pval_ep3));
disp(sprintf('random permutation Pval_rp3=%f',Pval_rp3));
disp(sprintf('hybrid permutation Pval_hp3=%f',Pval_hp3));
disp('For case 3, the computation costs (in seconds)');
disp(sprintf('exact permutation t_ep3=%f',t_ep3));
disp(sprintf('random permutation t_rp3=%f',t_rp3));
disp(sprintf('hybrid permutation t_hp3=%f',t_hp3));
disp(' ');
% display fitted Pearson distribution and exact permutation distribution
[Stat3, Ind3] = sort(mean_diff3); x3 = Stat3; y3 =fitcdf3(Ind3);
figure, mycdfplot(mean_diff3);hold on;
plot(Stat3,fitcdf3(Ind3),'--b','LineWidth',3);
legend('true','fitted',2); hold off;

%----- Case 4: Gama Distribution (unbalanced) -----
% initialize sample size
n1 = 6; n2 = 18; n = n1+n2;
% initialize moments coefficient
[Coef_3rd, Coef_4th] = MomentsCoef_MeanDiff(n, n1);
% generate random two-group samples
Data_A4 = gamrnd(3,2,1,n1); Data_B4 = gamrnd(3,1,1,n2); Data4 =
[Data_A4 Data_B4];
% exact permutaion
[Pval_ep4, t_ep4, mean_diff4] = ExactPerm_MeanDiff(Data4, n, n1);
% random permutation

```

```

[Pval_rp4, t_rp4] = RandPerm_MeanDiff(Data4, n, n1, num_rp);
% hybrid permutation
[Pval_hp4, fitcdf4, t_hp4]=HybridPerm_MeanDiff(Data4, n,
n1,Coef_3rd,Coef_4th,mean_diff4);
% display comparison results;
disp('For case 4, the p-value estimations');
disp(sprintf('exact permutation Pval_ep4=%f',Pval_ep4));
disp(sprintf('random permutation Pval_rp4=%f',Pval_rp4));
disp(sprintf('hybrid permutation Pval_hp4=%f',Pval_hp4));
disp('For case 4, the computation costs (in seconds)');
disp(sprintf('exact permutation t_ep4=%f',t_ep4));
disp(sprintf('random permutation t_rp4=%f',t_rp4));
disp(sprintf('hybrid permutation t_hp4=%f',t_hp4));
disp(' ');
% display fitted Pearson distribution and exact permutation distribution
[Stat4, Ind4] = sort(mean_diff4); x4 = Stat4; y4 =fitcdf4(Ind4);
figure, mycdfplot(mean_diff4);hold on;
plot(Stat4,fitcdf4(Ind4),'--b','LineWidth',3);
legend('true','fitted',2); hold off;

%----- Case 5: Beta Distribution (balanced) -----
% initialize sample size
n1 = 10; n2 = 10; n = n1+n2;
% initialize moments coefficient
[Coef_3rd, Coef_4th] = MomentsCoef_MeanDiff(n, n1);
% generate random two-group samples
Data_A5 = betarnd(0.8,0.8,1,n1); Data_B5 = betarnd(0.1,0.1,1,n2);
Data5 = [Data_A5 Data_B5];
% exact permutaion
[Pval_ep5, t_ep5, mean_diff5] = ExactPerm_MeanDiff(Data5, n, n1);
% random permutation
[Pval_rp5, t_rp5] = RandPerm_MeanDiff(Data5, n, n1, num_rp);
% hybrid permutation
[Pval_hp5, fitcdf5, t_hp5]=HybridPerm_MeanDiff(Data5, n,
n1,Coef_3rd,Coef_4th,mean_diff5);
% display comparison results;
disp('For case 5, the p-value estimations');
disp(sprintf('exact permutation Pval_ep5=%f',Pval_ep5));
disp(sprintf('random permutation Pval_rp5=%f',Pval_rp5));
disp(sprintf('hybrid permutation Pval_hp5=%f',Pval_hp5));
disp('For case 5, the computation costs (in seconds)');
disp(sprintf('exact permutation t_ep5=%f',t_ep5));
disp(sprintf('random permutation t_rp5=%f',t_rp5));
disp(sprintf('hybrid permutation t_hp5=%f',t_hp5));
disp(' ');

```

```

% display fitted Pearson distribution and exact permutation distribution
[Stat5, Ind5] = sort(mean_diff5); x5 = Stat5; y5 = fitcdf5(Ind5);
figure, mycdfplot(mean_diff5);hold on;
plot(Stat5,fitcdf5(Ind5),'--b','LineWidth',3);
legend('true','fitted',2); hold off;

%----- Case 6: Beta Distribution (unbalanced) -----
% initialize sample size
n1 = 6; n2 = 18; n = n1+n2;
% initialize moments coefficient
[Coef_3rd, Coef_4th] = MomentsCoef_MeanDiff(n, n1);
% generate random two-group samples
Data_A6 = betarnd(0.8,0.8,1,n1); Data_B6 = betarnd(0.1,0.1,1,n2);
Data6 = [Data_A6 Data_B6];
% exact permutaion
[Pval_ep6, t_ep6, mean_diff6] = ExactPerm_MeanDiff(Data6, n, n1);
% random permutation
[Pval_rp6, t_rp6] = RandPerm_MeanDiff(Data6, n, n1, num_rp);
% hybrid permutation
[Pval_hp6, fitcdf6, t_hp6]=HybridPerm_MeanDiff(Data6, n,
n1,Coef_3rd,Coef_4th,mean_diff6);
% display comparison results;
disp('For case 6, the p-value estimations');
disp(sprintf('exact permutation Pval_ep6=%f',Pval_ep6));
disp(sprintf('random permutation Pval_rp6=%f',Pval_rp6));
disp(sprintf('hybrid permutation Pval_hp6=%f',Pval_hp6));
disp('For case 6, the computation costs (in seconds)');
disp(sprintf('exact permutation t_ep6=%f',t_ep6));
disp(sprintf('random permutation t_rp6=%f',t_rp6));
disp(sprintf('hybrid permutation t_hp6=%f',t_hp6));
disp(' ');
% display CDFs of fitted Pearson distribution and exact permutation distribution
[Stat6, Ind6] = sort(mean_diff6); x6 = Stat6; y6 = fitcdf6(Ind6);
figure, mycdfplot(mean_diff6);hold on;
plot(Stat6,fitcdf6(Ind6),'--b','LineWidth',3);
legend('true','fitted',2); hold off;

%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%

function [Coef_3rd, Coef_4th] = MomentsCoef_MeanDiff(n, n1)
% [Coef_3rd, Coef_4th] = MomentsCoef_MeanDiff(n, n1)
%-----Initialize moments coefficients for hybrid permutation-----
% Input-----
% n: number of samples for both two groups;

```

```

%      n1: sample size for group A;
% Output-----
%      Coef_3rd: 3rd moment coefficients for hybrid permutation using
%                mean difference test statistics;
%      Coef_4th: 4th moment coefficients for hybrid permutation using
%                mean difference test statistics;
% Author: Chunxiao Zhou Email: czhou4@uiuc.edu

n2 = n-n1;
% Calculate 3rd moment coefficients (it only needs to be done once for repeated
% tests with the same sample size)
a_1_1_1 = 2*(n2-n1)/(n1^2)/(n2^2)/(n1+n2-1)/(n1+n2-2); a_1_2 =
(n1-n2)/(n1^2)/(n2^2)/(n1+n2-1); a_3 = (n2-n1)/(n1^2)/(n2^2);
Coef_3rd = [a_1_1_1, a_1_2, a_3];

%-----
% Calculate 4th moment coefficients (it only needs to be done once for repeated
% tests with the same sample size)
a_1_1_1_1 =
nchoosek(n1,4)/(n1^4)-nchoosek(n1,3)*nchoosek(n2,1)/(n1^3)/n2+...
    nchoosek(n1,2)*nchoosek(n2,2)/(n1^2)/(n2^2)-nchoosek(n1,1)*...
    nchoosek(n2,3)/(n1)/(n2^3)+nchoosek(n2,4)/(n2^4);
a_1_1_1_1 = a_1_1_1_1/nchoosek(n,4); a_1_1_2 =
nchoosek(n1,3)*(1/(n1^4))-2/3*nchoosek(n1,2)*...
    nchoosek(n2,1)/(n1^3)/n2+1/3*nchoosek(n1,2)*nchoosek(n2,1)/(n1^2)/(n2^2)...
    +1/3*nchoosek(n1,1)*nchoosek(n2,2)/(n1^2)/(n2^2)-2/3*nchoosek(n1,1)*...
    nchoosek(n2,2)/(n1)/(n2^3)+nchoosek(n2,3)/(n2^4);
a_1_1_2 = a_1_1_2/nchoosek(n,3); a_1_3 =
nchoosek(n1,2)/(n1^4)-1/2*nchoosek(n1,1)*nchoosek(n2,1)/(n1^3)/n2-...
    1/2*nchoosek(n1,1)*nchoosek(n2,1)/(n1)/(n2^3)+nchoosek(n2,2)*(1/(n2^4));
a_1_3 = a_1_3/nchoosek(n,2); a_2_2 =
nchoosek(n1,2)/(n1^4)+nchoosek(n1,1)*nchoosek(n2,1)/(n1^2)/(n2^2)+...
    nchoosek(n2,2)/(n2^4);
a_2_2 = a_2_2/nchoosek(n,2); a_4 =
nchoosek(n1,1)/(n1^4)+nchoosek(n2,1)/(n2^4); a_4 =
a_4/nchoosek(n,1); Coef_4th = [a_1_1_1_1, a_1_1_2, a_1_3, a_2_2,
a_4];

%%%%%%%%%%
%%%%%%%%%%

function [Pval_ep, t_ep, mean_diff]=ExactPerm_MeanDiff(Data, n, n1)
% [Pval_ep, t_ep, mean_diff]=ExactPerm_MeanDiff(Data, n, n1)
% Exact Permutation for mean difference test statistic
% Input-----

```

```

%      n: number of samples for both two groups;
%      n1: sample size for group A;
%      Data: univariate data sequences; first n1 items belong to group A,
%            the rest belongs to group B;
% Output-----
%      Pval_ep: P value;
%      t_ep: computation time;
%      mean_diff: mean difference test statistics for all permutations.
% Author: Chunxiao Zhou Email: czhou4@uiuc.edu

x = Data; tic; sum_x = sum(x); num_permutation = nchoosek(n,n1);
perm_all = nchoosek([1:n],n1); sum_a = sum(x(perm_all),2); sum_b =
sum_x-sum_a; mean_diff = sum_a/n1-sum_b/(n-n1); [Stat,IndStat] =
sort(mean_diff); I1 = find(IndStat==1); Pval_ep =
I1/num_permutation; t_ep = toc;

%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%

function [Pval_rp, t_rp]=RandPerm_MeanDiff(Data, n, n1, num_rp)
% [Pval_rp, t_rp]=RandPerm_MeanDiff(Data, n, n1, num_rp)
% Random Permutation for mean difference test statistic
% Input-----
%      n: number of samples for both two groups;
%      n1: sample size for group A;
%      Data: univariate data sequences; first n1 items belong to group A,
%            the rest belongs to group B;
%      num_rp: number of random permutations;
% Output-----
%      Pval_rp: P value;
%      t_rp: computation time;
% Author: Chunxiao Zhou Email: czhou4@uiuc.edu

stat_rp = zeros(1, num_rp); stat_rp(1) =
mean(Data(1:n1))-mean(Data((n1+1):n)); tic; for i = 2:num_rp
    perm_ind = randperm(n);
    stat_rp(i) = mean(Data(perm_ind(1:n1)))-mean(Data(perm_ind(n1+1:n)));
end [stat_rp_all,IndStat] = sort(stat_rp); I2 = find(IndStat==1);
Pval_rp = I2/num_rp; t_rp = toc;

%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%

function [Pval_hp, fitpdf, t_hp]=HybridPerm_MeanDiff(Data, n,
n1,Coef_3rd,Coef_4th,mean_diff)

```

```

% [Pval_hp, fitpdf, t_hp]=HybridPerm_MeanDiff(Data, n, n1,Coef_3rd,Coef_4th,mean_diff)
% Hybrid Permutation for mean difference test statistic
% Input-----
%   n: number of samples for both two groups;
%   n1: sample size for group A;
%   Data: univariate data sequences; first n1 items belong to group A,
%         the rest belongs to group B;
%   Coef_3rd: coefficient for the third moment calculation;
%   Coef_4th: coefficient for the fourth moment calculation;
%   mean_diff: mean difference test statistics for all permutations.
% Output-----
%   Pval_hp: P value;
%   fitpdf: pdf values of fitted Pearson distribution at values of mean_diff;
%   t_hp: computation time;
% Author: Chunxiao Zhou Email: czhou4@uiuc.edu

x = Data; n2 = n-n1;
% get original mean difference test statistic
initialStat = mean(x(1:n1))-mean(x((n1+1):n));
%-----calculate summation terms-----
tic; sum_x = sum(x); sum_x2 = sum(x.^2); sum_x3 = sum(x.^3); sum_x4
= sum(x.^4); sum_x1_1 = sum_x^2-sum_x2; sum_x1_2 =
3*(sum_x2*sum_x-sum_x3); sum_x1_3 = 4*(sum_x*sum_x3-sum_x4);
sum_x2_2 = 3*(sum_x2^2-sum_x4); sum_x1_1_1 =
sum_x1_1*sum_x-sum_x1_2*2/3; sum_x1_1_2 =
6*(sum_x1_1*sum_x2-sum_x1_3/2); sum_x1_1_1_1 =
sum_x^4-sum_x4-sum_x2_2-sum_x1_3-sum_x1_1_2;

Theoretic_1st_moment_x = 0; Theoretic_2nd_moment_x =
(1/n1+1/n2)*(std(x)^2); Theoretic_3rd_moment_x =
Coef_3rd*[sum_x1_1_1,sum_x1_2,sum_x3]'; Theoretic_4th_moment_x =
Coef_4th*[sum_x1_1_1_1,sum_x1_1_2,sum_x1_3,sum_x2_2,sum_x4]';

mu = Theoretic_1st_moment_x; sigma = sqrt(Theoretic_2nd_moment_x);
skew = Theoretic_3rd_moment_x/(sigma^3); kurt =
Theoretic_4th_moment_x/(sigma^4); t_hp = toc;
% Pearson distribution series fitting;
[Pval_hp,type,fitpdf,t_fitting] =
pearsfitting(mu,sigma,skew,kurt,initialStat,mean_diff); t_hp =
t_hp+t_fitting;

%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%

function [pvalue,type,fitcdf,t_fitting] =

```

```

pearsfitting(mu,sigma,skew,kurt,statvalue,allstat)
% [pvalue,type,fitcdf,t_fitting] = pearsfitting(mu,sigma,skew,kurt,statvalue,allstat)
%revision from the matlab function pearsrnd;
%Approximate the empirical distribution by Pearson distribution system.
% Input-----
%   mu: mean of empirical distribution;
%   sigma: standard deviation of empirical distribution;
%   skew: skewness of empirical distribution;
%   kurt: kurtosis of empirical distribution;
%   statvalue: a value of distribution variable;
%   allstat: a sequence of values of distribution variable;
% Output-----
%   pvalue: p-value for statvalue;
%   fitpdf: pdf values of allstat;
%   type: type of Pearson distribution;
%   t_fitting: computation cost of p-value for statvalue;

% The seven types of distribution in the the Pearson series correspond to the
% following distributions:
%   Type 0: Normal distribution
%   Type 1: Four-parameter beta
%   Type 2: Symmetric four-parameter beta
%   Type 3: Three-parameter gamma
%   Type 4: Not related to any standard distribution. Density proportional
%           to  $(1+((x-a)/b)^2)^{-c} * \exp(-d*\arctan((x-a)/b))$ .
%   Type 5: Inverse gamma location-scale
%   Type 6: F location-scale
%   Type 7: Student's t location-scale

% PEARSRND uses transformations of various standard random variates for types
% 0-III and types V-VII, and a rejection algorithm for type IV.

% References:
%   [1] Johnson, N.L., S. Kotz, and N. Balakrishnan (1994)
%       Continuous Univariate Distributions, Volume 1, Wiley-Interscience.
%   [2] Devroye, L. (1986)
%       Non-Uniform Random Variate Generation, Springer-Verlag.

tic if nargin < 4
    error('stats:pearsrnd:TooFewInputs','Requires at least four input arguments.');
```

```

elseif ~(isscalar(mu) && isscalar(sigma) && isscalar(skew) &&
isscalar(kurt))
    error('stats:pearsrnd:NonScalarInputs','MU, SIGMA, SKEW, and KURT must be scalars.');
```

```

end

```

```

outClass = superiorfloat(mu,sigma,skew,kurt);

beta1 = skew.^2; beta2 = kurt;

% Return NaN for illegal parameter values.
if (sigma < 0) || (beta2 <= beta1 + 1)
    pvalue = NaN;
    type = NaN;
    return
end statvalue = (statvalue-mu)./sigma; allstat=(allstat-mu)./sigma;
% Classify the distribution and find the roots of  $c_0 + c_1x + c_2x^2$ 
c0 = (4*beta2 - 3*beta1); % ./ (10*beta2 - 12*beta1 - 18);
c1 = skew .* (beta2 + 3); % ./ (10*beta2 - 12*beta1 - 18);
c2 = (2*beta2 - 3*beta1 - 6); % ./ (10*beta2 - 12*beta1 - 18);
if c1 == 0 % symmetric dist'ns
    if beta2 == 3
        type = 0;
    else
        if beta2 < 3
            type = 2;
        elseif beta2 > 3
            type = 7;
        end
        a1 = -sqrt(abs(c0./c2));
        a2 = -a1; % symmetric roots
    end
elseif c2 == 0 % kurt = 3 + 1.5*skew^2
    type = 3;
    a1 = -c0 ./ c1; % single root
else
    kappa = c1.^2 ./ (4*c0.*c2);
    if kappa < 0
        type = 1;
    elseif kappa < 1-eps
        type = 4;
    elseif kappa <= 1+eps
        type = 5;
    else
        type = 6;
    end
    % Solve the quadratic for general roots a1 and a2 and sort by their real parts
    tmp = -(c1 + sign(c1).*sqrt(c1.^2 - 4*c0.*c2)) ./ 2;
    a1 = tmp ./ c2;
    a2 = c0 ./ tmp;
    if (real(a1) > real(a2)), tmp = a1; a1 = a2; a2 = tmp; end

```



```

end

denom = (10*beta2 - 12*beta1 - 18); if abs(denom) > sqrt(realmin)
    c0 = c0 ./ denom;
    c1 = c1 ./ denom;
    c2 = c2 ./ denom;
    coefs = [c0 c1 c2];
else
    type = 1; % this should have happened already anyway
    % beta2 = 1.8 + 1.2*beta1, and c0, c1, and c2 -> Inf. But a1 and a2 are
    % still finite.
end

% generate standard (zero mean, unit variance) values
switch type

case 0
    % normal: standard support (-Inf,Inf)
    pvalue = normcdf(statvalue,0,1); t_fitting = toc; fitcdf =
    normcdf(allstat);

case 1
    % four-parameter beta: standard support (a1,a2)
    if abs(denom) > sqrt(realmin)
        m1 = (c1 + a1) ./ (c2 .* (a2 - a1));
        m2 = -(c1 + a2) ./ (c2 .* (a2 - a1));
    else
        % c1 and c2 -> Inf, but c1/c2 has finite limit
        m1 = c1 ./ (c2 .* (a2 - a1));
        m2 = -c1 ./ (c2 .* (a2 - a1));
    end
    pvalue = betacdf((statvalue-a1)./(a2-a1),m1+1,m2+1);
    t_fitting = toc;
    fitcdf = betacdf((allstat-a1)./(a2-a1),m1+1,m2+1);

case 2
    % symmetric four-parameter beta: standard support (-a1,a1)
    m = (c1 + a1) ./ (c2 .* 2*abs(a1));
    pvalue = betacdf((statvalue-a1)/2./abs(a1),m+1,m+1);
    t_fitting = toc;
    fitcdf = betacdf((allstat-a1)/2./abs(a1),m+1,m+1);

case 3
    % three-parameter gamma: standard support (a1,Inf) or (-Inf,a1)
    m = (c0./c1 - c1) ./ c1;
    pvalue = gamcdf((statvalue-a1)./c1,m+1,1);
    t_fitting = toc;

```


%%%

```
function pvalue = pearson4cdf(r,m,nu,a,lambda)
% pvalue = pearson4cdf(r,m,nu,a,lambda)
% Pearson distribution series cumulative distribution function (cdf).
%
% References:
% [1] Devroye, L. (1986). Non-Uniform Random Variate Generation,
% Springer-Verlag. Also available in PDF format on-line at
% http://cgm.cs.mcgill.ca/~luc/rnbookindex.html.
% [2] Heinrich, J. (2004). A Guide to the Pearson Type IV Distribution,
% CDF/MEMO/STATISTICS/PUBLIC/6820, available on-line at
% http://www-cdf.fnal.gov/publications/cdf6820\_pearson4.pdf.

pvalue=zeros(length(r),1); for i = 1:length(r)
if r(i)>(lambda+a*sqrt(3))
    nu = -nu;
    lambda = -lambda;
    r(i) = -r(i);
else
if r(i)>(lambda-a*sqrt(3))
    pvalue(i) = 1/(1-exp(-(nu+2i*m)*pi)) - i*a*pearson4pdf(r(i),m,nu,a,lambda)/...
(i*nu-2*m+2)*(1+((r(i)-lambda)/a).^2)*hypergeom([1,2-2*m],2-m+i*nu/2,(1+i*(r(i)-lambda)/a)/2);
else
    pvalue(i) = a/(2*m-1)*(i-(r(i)-lambda)/a)*pearson4pdf(r(i),m,nu,a,lambda)*...
hypergeom([1,m+i*nu/2],2*m,2/(1-i*(r(i)-lambda)/a));
if r(i)>(lambda+a*sqrt(3))
    pvalue(i) = 1-pvalue(i);
end
end
end
end
end
```

%%%

```
function f = pearson4pdf(r,m,nu,a,lambda)
% function f = pearson4pdf(r,m,nu,a,lambda)
% Pearson distribution series probability density function (pdf).
%
% References:
% [1] Heinrich, J. (2004). A Guide to the Pearson Type IV Distribution,
% CDF/MEMO/STATISTICS/PUBLIC/6820, available on-line at
% http://www-cdf.fnal.gov/publications/cdf6820\_pearson4.pdf.
```

```
K = (1./HypGeo(m,nu/2)).*exp(gammaln(m) - gammaln(m-.5)) ./
(sqrt(pi)*a); f =
K*((1+((r-lambda)/a).^2).^m).*exp(-nu*atan((r-lambda)/a));
```

```
%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
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```

```
function [handleCDF] = mycdfplot(x)
%Revised from the matlab function CDFPLOT
%MYCDFPLOT Display an empirical cumulative distribution function.
% MYCDFPLOT(X) plots an empirical cumulative distribution function (CDF)
% of the observations in the data sample vector X. X may be a row or
% column vector, and represents a random sample of observations from
% some underlying distribution.
%
% H = MYCDFPLOT(X) plots F(x), the empirical (or sample) CDF versus the
% observations in X. The empirical CDF, F(x), is defined as follows:
%
% F(x) = (Number of observations <= x)/(Total number of observations)
%
% for all values in the sample vector X. If X contains missing data
% indicated by NaN's (IEEE arithmetic representation for
% Not-a-Number), the missing observations will be ignored.
%
% H is the handle of the empirical CDF curve (a Handle Graphics 'line'
% object).

[yy,xx,n,msg,eid] = cdfcalc(x); if ~isempty(eid)
    error(sprintf('stats:mycdfplot:%s',eid),msg);
end
% Create vectors for plotting
k = length(xx); n = reshape repmat(1:k, 2, 1), 2*k, 1); xCDF =
[-Inf; xx(n); Inf]; yCDF = [0; 0; yy(1+n)];
% Now plot the sample (empirical) CDF staircase.
hCDF = plot(xCDF , yCDF,'r','LineWidth',3); if (nargout>0),
handleCDF=hCDF; end
```

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