## ARTICLE IN PRESS

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# Comments on "Ellipse area calculations and their applicability in posturography" (Schubert and Kirchner, vol.39, pages 518-522, 2014)

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#### Dear Editor:

I would like to congratulate the authors for the article regarding the calculation of the so-called ellipse area [1]. As the authors indicated, the algorithms employed to calculate the area of the 95% prediction ellipse using the chi-square or the Rayleigh distribution are in fact only exact when the number of samples of the bivariate variable tends to infinite (when each univariate variable is assumed to have a normal distribution) [2]. As the authors also observed, for a typical data size in posturography, 30 s of data sampled at 100 Hz (3000 samples), this approximation is probably good enough, since the error is only 0.1%. The problem appears when the data size is much less: for 100 samples, the error is 2.5%, and for 10 samples, the error is 26%. These last two cases are unlikely scenarios in posturography, but possible for an unadvised user; and besides, the prediction ellipse area can be employed in any other data analysis. The authors described the calculation (see the supplementary data in [1]) but did not publish any algorithm to compute the exact 95% prediction ellipse area. They only made available the algorithm with the known approximation (i.e., they used the chi-square distribution and not the F distribution for the exact calculation). To fill this lacuna, at the end of this letter it is presented a computer program to calculate the exact 95% prediction ellipse area [2] for a Matlab-like environment software

The webpage 'Prediction ellipse and prediction ellipsoid' at the website <a href="https://github.com/demotu/BMC">https://github.com/demotu/BMC</a> contains a detailed explanation about the prediction ellipse and a more complete code written in Python to compute and plot the results and other variables.

http://dx.doi.org/10.1016/j.gaitpost.2014.08.008 0966-6362/© 2014 Elsevier B.V. All rights reserved.  $\begin{tabular}{ll} \% & Matlab code to calculate the hypervolume \\ & of the exact 95\% prediction hyper-ellipsoid: \\ & [n,p] = size(data); & \% 2-D array dimensions \\ & covar = cov(data); & \% covariance matrix of data \\ & [U,S,V] = svd(covar); & \% singular value decomposition \\ & p5 = finv(.95,p,n-p)*(n-1)* & \% F 95 percent point function \\ & p^*(n+1)/n/(n-p); \\ & saxes = sqrt(diag(S)*f95); & \% semi-axes lengths \\ & hypervolume = pi^(p/2)/gamma \\ & (p/2+1)*prod(saxes) & \\ \end{tabular}$ 

and the same algorithm implemented in the Python language, a free and open source software. The program input, the variable 'data', has 'n' rows (the number of samples) and two columns for a bivariate data. In fact, this computer program is written to also calculate the hypervolume of a hyper-ellipsoid (with p dimensions) if 'data' has p columns. Briefly, the volume of the hyper-ellipsoid is calculated with the same equation for the volume of a p-dimensional ball (http://en.wikipedia.org/wiki/Volume\_of\_an\_n-ball) with the radius replaced by the semi-axes of the hyper-ellipsoid. The variable 'hypervolume' contains the calculated ellipse area for 2-D data or the hypervolume for p-dimensional

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# Python code to calculate the hypervolume of the exact 95% prediction hyper-ellipsoid: import numpy as np from scipy.stats import f as F from scipy.special import gamma n, p = np.asarray(data).shape cov = np.cov(data, rowvar = 0) U, s, Vt = np.linalg.svd(cov) f95 = F.ppf(.95,p,n - p)\*(n - 1)\* p\*(n + 1)/n/(n - p)

saxes = np.sqrt(s\*f95)

hypervolume

hypervolume = np.pi\*\*(p/2)/
gamma(p/2 + 1)\*np.prod(saxes)

- # import Numpy package
- # import F distribution
- # import Gamma function
- # 2-D array dimensions
- # covariance matrix of data
- # singular value decomposition # F 95 percent point function
- # semi-axes lengths

#### **Conflicts of interest statement**

There author declares no conflicts of interest.

#### References

- [1] Schubert P, Kirchner M. Ellipse area calculations and their applicability in posturography. Gait Posture 2014;39:518–22.
- Chew V. Confidence, prediction, and tolerance regions for the multivariate normal distribution. J Am Stat Assoc 1966;61:605–17.

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