

Accurate determination of the principal moments of inertia

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ABSTRACT

The moments of inertia of an object or objects are required for performing mechanical analysis. In many applications the moments of inertia are determined by measuring the distribution of the mass within a body. Given these mass distributions the inertia tensor is determined numerically, by summing the products of point masses and their distributions squared. The principal moments of inertia and the principal axes are determined from eigenvalues and eigenvectors of the inertia tensor. Here an alternative approach for determining the principal moments of inertia and the principal axes is presented; this approach is faster than the eigen-analysis approach, and is less sensitive to rounding errors.

Keywords: inertia tensor, eigenvector, eigenvalue, singular value decomposition.

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1 **INTRODUCTION**

2 The moments of inertia of an object or objects are required for performing
3 mechanical analysis. For example, in human biomechanics, body segment moments of
4 inertia are required for the computation of the resultant joint moments [e.g., 1, 2]. The
5 analysis of the mechanical properties of bones can, in part, be quantified by assessing
6 their moments of inertia [3]. In many applications the moments of inertia are
7 determined by measuring the distribution of the mass within a body. This work
8 addresses how the moments of inertia can be determined from such data while
9 reducing the influence of errors in the measurements of the mass distribution.

10 In determining the moments of inertia of the body segments mass distribution of
11 a segment has been determined using magnetic resonance imaging [e.g., 4], and dual-
12 energy X-ray absorptiometry [e.g., 5]. In such analyses the density of the different
13 tissues comprising the segments are assumed to be known and the mass distributions
14 measured. Given these data the inertia tensor can be determined. It is possible to
15 define a set of axes so the products of inertia are zero, in this case the axes are called
16 the principal axes, and the moments of inertia (matrix diagonal terms) the principal
17 moments of inertia.

18 The traditional approach for determining these principal moments of inertia and
19 the principal axes is to compute the eigenvectors and eigenvalues of the inertia tensor
20 [6, 7]. Here an alternative procedure will be presented which is less sensitive to errors
21 in the measurements of the mass distribution. Therefore, the purposes of this study
22 were to 1) present a new method determining the principal moments of inertia and

23 their corresponding axes, and 2) to compare this new approach to the traditional
24 approach.

25

26 METHODS

27 In three-dimensions for an object the inertia tensor with reference to a
28 reference frame A is,

$$29 \quad J^A = \begin{bmatrix} J_{xx} & -J_{xy} & -J_{xz} \\ -J_{yx} & J_{yy} & -J_{yz} \\ -J_{zx} & -J_{zy} & J_{zz} \end{bmatrix} \quad (1)$$

30

31 It is possible to define a set of axes so the products of inertia, non-diagonal terms, are
32 zero. In this case the axes defining the reference frame are called the principal axes,
33 and the moments of inertia, diagonal terms in the resulting inertia tensor, the principal
34 moments of inertia. In the following two methods for determining the principal axes
35 and principal moments of inertia are presented.

36 **Method 1** – This is the approach traditionally taken based on computing the
37 eigenvalue and eigenvector of the inertia tensor [7]. For a body made up of a certain
38 number of particles (np), the components of the inertia tensor can be computed using
39 the coordinates the particles (x_i, y_i, z_i) in reference system A, and the masses of the
40 particles (m_i). Therefore, the components of this inertia tensor (J^A) can be computed
41 from,

$$42 \quad J^A = \begin{bmatrix} \sum^{np} m_i (y_i^2 + z_i^2) & -\sum^{np} m_i \cdot x_i \cdot y_i & -\sum^{np} m_i \cdot z_i \cdot x_i \\ -\sum^{np} m_i \cdot x_i \cdot y_i & \sum^{np} m_i (x_i^2 + z_i^2) & -\sum^{np} m_i \cdot y_i \cdot z_i \\ -\sum^{np} m_i \cdot z_i \cdot x_i & -\sum^{np} m_i \cdot y_i \cdot z_i & \sum^{np} m_i (x_i^2 + y_i^2) \end{bmatrix} \quad (2)$$

43 The eigenvalues of an inertia tensor are the principal moments of inertia, and
 44 the eigenvectors the principal axes [8]. The transformation of an inertia tensor to one
 45 that only contains the principal moments of inertia (J^P) is feasible because the inertia
 46 tensor is a symmetric matrix which therefore has real eigenvalues and eigenvectors, and
 47 these eigenvectors are mutually orthogonal [9]. In addition, as the tensor is positive-
 48 definitive the eigenvalues will be positive, a requirement for moments of inertia.

49 **Method 2** – This is a new approach based on the use of the singular value
 50 decomposition of a matrix. The tensor of a body (J^A), with respect to a reference A , has
 51 the following relationship [8],

$$52 \quad J^A = tr(L) I - L \quad (3)$$

53 Where,

54 $tr(L)$ – is the trace of matrix L

55 I – is the identity matrix

56 $L = \sum_{i=1}^{np} m_i p_i p_i^T$ where p_i is the x , y , and z coordinates of the point mass i .

57 All three matrices in 3 are positive-definitive symmetric matrices.

58 The eigenvalues of J^A are the principal moments of inertia, and are equal to the
 59 difference between the eigenvalues of $tr(L) I$ and L . The trace of matrix L is equal to
 60 the sum of the eigenvalues of matrix L . Therefore, if the eigenvalues of L are
 61 determined then the eigenvalues of J^A can be determined. The eigenvectors of J^A are
 62 the principal axes, which are the same as the eigenvectors of matrix L . This occurs
 63 because the eigenvectors of L are the same as those of $tr(L) I - L$, noting that

64 $(tr(L) I - L) v = tr(L) I v - L v$ which demonstrates an eigenvector (v) of L is also an
 65 eigenvector of $tr(L) I$.

66 The matrix L is equal to,

$$67 \quad L = K K^T \quad (4)$$

68 Where,

$$69 \quad K = \begin{bmatrix} x_i \sqrt{m_i} & x_{i+1} \sqrt{m_{i+1}} \dots & x_{np} \sqrt{m_{np}} \\ y_i \sqrt{m_i} & y_{i+1} \sqrt{m_{i+1}} \dots & y_{np} \sqrt{m_{np}} \\ z_i \sqrt{m_i} & z_{i+1} \sqrt{m_{i+1}} \dots & z_{np} \sqrt{m_{np}} \end{bmatrix} \quad (5)$$

70

71 For matrix J^A its eigenvalues can be determined by exploiting the properties of
 72 the singular value decomposition of K . For matrix K the singular value decomposition is
 73 determined [10],

$$74 \quad K = U W V^T \quad (6)$$

75 Where,

76 U – 3 x 3 orthogonal matrix, whose columns are the eigenvectors of the matrix $K K^T$

77 W – 3 x np diagonal matrix comprising the three singular values ($\sigma_1, \sigma_2, \sigma_3$), the

78 square of the singular values are the eigenvalues of the matrix $K K^T$ and $K^T K$

79 V – np x np orthogonal matrix, its columns are the eigenvectors of the matrix $K^T K$

80 Note that here the singular value decomposition relates to the eigenvectors and

81 eigenvalues not of K but of $K^T K$ or $K K^T$. Based on equation 3 the eigenvalues of J^A can

82 be determined from the singular values of matrix K ,

$$83 \quad J_{XX} = \sigma_2^2 + \sigma_3^2 \quad (7)$$

$$84 \quad J_{YY} = \sigma_1^2 + \sigma_3^2 \quad (8)$$

85
$$J_{ZZ} = \sigma_1^2 + \sigma_2^2 \tag{9}$$

86 In theory the advantage of this new method for determining the inertia tensor is
87 that it avoids the squaring of the coordinate measurements that are required in
88 equation 2. If these measurements are numerically small, then on squaring they could
89 test the accuracy of the floating-point representation of small numbers thus impacting
90 the determination of the inertia tensor with respect to the principal axes. Computer
91 computations are sensitive to calculations which test the limits of the floating-point
92 representation of small numbers [11, 12].

93

94 **EXAMPLES**

95 **Example 1:** As an example of the exploitation of the new method it was applied to data
96 previously provided [6]. In the original work the foot-pound-second (fps) system of
97 units was used, here it is assumed these are SI units. Therefore, the system consists of
98 four particles each of unit mass, and coordinates of $(0, \sqrt{50}, 0)$, $(0, -\sqrt{50},$
99 $0)$, $(10, 0, 5)$, and $(10, 0, -5)$. This produces the following inertia tensor (from
100 equation 2),

101
$$J^A = \begin{bmatrix} 150 & 0 & -100 \\ 0 & 250 & 0 \\ -100 & 0 & 300 \end{bmatrix} kg.m^2$$

102

103 The inertia tensor about the principal axes and rotation matrix produced by both
104 methods were equivalent. The inertia matrix with respect to the principal axes was,

105
$$J^P = \begin{bmatrix} 100 & 0 & 0 \\ 0 & 250 & 0 \\ 0 & 0 & 350 \end{bmatrix} kg.m^2$$

106 As would be expected for an inertia tensor $tr(J^A) = tr(J^P)$. Both methods gave
107 equivalent principal axes, as they did for all examples. Method 1, the method based on
108 the computation of eigenvalues and vectors, took over five times the processing time in
109 MATLAB compared with the SVD based procedure; similar differences in processing time
110 were determined for all examples.

111 **Example 2:** While the increased speed of the new method might make it
112 attractive for some applications, there is another situation where it has a valuable
113 feature. In any computer based computation, errors can occur because the numbers
114 within the computer architecture are subject to the finite precision of the floating-point
115 representation of a number [11].

116 For a system of just three particles each of unit mass, and coordinates of
117 $(\frac{1}{\sqrt{2}}, 0, 0)$, $(0, \frac{1}{\sqrt{2}}, 0)$, and $(0, 0, \frac{1}{\sqrt{2}})$ with respect to an inertial reference frame.
118 By inspection the principal moments of inertia are $J_{XX} = J_{YY} = J_{ZZ} = 1 \text{ kg} \cdot \text{m}^2$. As
119 would be expected both methods give this result. If the reference frame in which these
120 three masses are embedded, is rotated away from the inertial reference, this gives the
121 three points masses new coordinates. If these three rotations are of 45° about the x,
122 the y, and finally the z axes, then the inertia tensor can be recomputed using these new
123 coordinates. The cosine and sine of 45° is an irrational number so cannot be fully
124 represented in floating-point representations, potentially making this calculation more
125 problematic. From the eigen-analysis the inertia tensor is,

126
$$J^P = \begin{bmatrix} 1 & 1.4 \times 10^{-18} & 0 \\ 1.4 \times 10^{-18} & 1 & -8.7 \times 10^{-19} \\ 0 & -8.7 \times 10^{-19} & 1 \end{bmatrix} \text{ kg} \cdot \text{m}^2$$

127 The small values for the products of inertia arise because of rounding errors
128 occurring, which are exasperated by the squaring of the coordinate data in the
129 computation of the inertia tensor described in equation 2. The SVD-analysis does not
130 require such squared values, see equation 3, and provides the following inertia tensor,

$$131 \quad J^P = \begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix} kg.m^2$$

132 To further illustrate the advantage of the new method a scenario is examined where
133 one point is measured at a value close to the precision of the computer (ϵ). For a given
134 computing environment to value of ϵ is the smallest number that a computer recognizes
135 as being very much bigger than zero, so for example when a number below machine
136 epsilon is added to or subtracted from a second larger number that second number
137 does not change. For a simpler system the coordinates of the unit-point masses are
138 now $\left(\frac{1}{\sqrt{2}}, \frac{1}{\sqrt{2}}\right)$, and $\left(\frac{-\epsilon}{\sqrt{2}}, \frac{-\epsilon}{\sqrt{2}}\right)$. By inspection the eigenvalues representing the principal
139 moments of inertia should be $1 kg.m^2$ and $\epsilon^2 kg.m^2$. Letting $\epsilon = 2.22 \times 10^{-16}$ [13],
140 the eigenvalues of equation 2 are $1 kg.m^2$ and $0 kg.m^2$, while the SVD analysis
141 accurately produces $1 kg.m^2$ and $\epsilon^2 kg.m^2$.

142 In the system just described one moment of inertia is much larger than the other
143 so that for mechanical analysis the influence of the error arising from the eigen-analysis
144 approach could be small. But in the situation where all measurements approach the
145 limit of the floating-point representation of those measurements the eigen-analysis
146 method could produce non-sensical results. The concept of approaching this
147 measurement limit is compounded in the computation of the elements of equation 2,
148 because the products of those measurements are squared.

149

150

151 **CONCLUSION**

152 A new method has been presented which given the locations of point masses
153 can compute the principal moments of inertia. It has been demonstrated that this new
154 method can estimate these moments of inertia with greater accuracy, and with greater
155 speed than the traditional method which relies on the computation of eigenvalues and
156 eigenvectors.

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