Importance of Consistent Datasets in Musculoskeletal Modelling: A Study of the Hand and Wrist

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Abstract—Hand musculoskeletal models provide a valuable insight into the loads withstood by the upper limb; however, their development remains challenging because there are few datasets describing both the musculoskeletal geometry and muscle morphology from the elbow to the finger tips. Clinical imaging, optical motion capture and microscopy were used to create a dataset from a single specimen. Subsequently, a musculoskeletal model of the wrist was developed based on these data to estimate muscle tensions and to demonstrate the potential of the provided parameters. Tendon excursions and moment arms predicted by this model were in agreement with previously reported experimental data. When simulating a flexion–extension motion, muscle forces reached 90 N among extensors and a co-contraction of flexors, amounting to 62.6 N, was estimated by the model. Two alternative musculoskeletal models were also created based on anatomical data available in the literature to illustrate the effect of combining incomplete datasets. Compared to the initial model, the intensities and load sharing of the muscles estimated by the two alternative models differed by up to 180% for a single muscle. This confirms the importance of using a single source of anatomical data when developing such models.

Keywords—Clinical imaging, Motion capture, Digitization, Instantaneous helical axes, Sarcomere length, Moment arms, Tendon excursions, Muscle force.

LIST OF SYMBOLS

\[m_m\]
Mass of muscle \(m\)

\[\rho_m\]
Density of muscle \(m\)

\[f^o\]
Optimal fibre length

\[f_m\]
Muscle force of muscle \(m\)

\[[I_h]\]
Inertia matrix of the hand at the wrist joint centre

\[\dot{\theta}(t)\]
Angular acceleration of the hand centre of mass

\[\bar{M}_p\]
Moment due to passive constraints in the wrist joint

\[\bar{M}_e\]
Moment due to the external forces applied to the hand

\[\bar{r}_m\]
Moment arm vector of muscle \(m\)

\[\sigma_{\text{max}}\]
Maximum muscle stress

\[\bar{R}_j\]
Joint reaction force at the wrist

\[\bar{x}_{\text{radius}}\]
Antero-posterior axis of the radius

\[\bar{y}_{\text{radius}}\]
Longitudinal axis of the radius

\[\bar{z}_{\text{radius}}\]
Medio-lateral axis of the radius

\[\beta\]
Angle between antero-posterior and medio-lateral components of joint reaction force and longitudinal axis of the radius

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ABBREVIATIONS

APL Abductor pollicis longus

CT Computed tomography

ECRB Extensor carpi radialis brevis

ECRL Extensor carpi radialis longus

ECU Extensor carpi ulnaris

FE Flexion–extension

ISB International Society of Biomechanics

FCR Flexor carpi radialis

FCU Flexor carpi ulnaris

MC3 Third metacarpal

MRI Magnetic resonance imaging

PCSA Physiological cross-sectional area

PL Palmaris longus

RUD Radial–ulnar deviation

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INTRODUCTION

The hand is essential for daily living. It is required for many vital tasks, e.g., eating, and is used during both forceful and fine manipulation tasks, e.g., hammering and sewing. Musculoskeletal disorders affecting the hands, such as osteoarthritis, can thus be dramatically debilitating. However, our limited understanding of hand biomechanics hinders the development of appropriate prevention, treatment, and rehabilitation methods. The hand is comprised of 27 bones and 54 tendons12 but, for ethical and technical reasons, they cannot be used to measure the simultaneous actions of the numerous hand muscles. Physiological joint simulators have been able to determine the muscle/tendon moment arms and joint angles for the wrist prime movers14,18 and other muscles.4 However, these relationships were functionally measured using joint displacement and tendon excursion2 rather than using the positions of points along the muscle/tendon path.7 Hence, although data are available for the fingers and wrist, the types of data and calculation methods differ. Finally, for none of the datasets mentioned above is the morphology of the muscles of the specimens provided. These parameters have been measured, but only for certain muscle groups, such as the wrist prime movers16 or the hand extrinsic muscles.17

The main objectives of this study were (1) to obtain a complete anatomical dataset, providing a description of the musculoskeletal system of the forearm and the hand, including muscle/tendon geometrical paths and muscle morphological parameters, (2) to design a wrist musculoskeletal model using the collected dataset and estimate muscle forces during a simple wrist motion to demonstrate the potential of the model and (3) to demonstrate the effect of combining different anatomical datasets in the same musculoskeletal model. We hypothesized that the different datasets would result in different estimations of the muscle forces and load sharing.

METHODS

Collection of the Anatomical Dataset

The dataset was collected from the left forearm of a fresh-frozen cadaveric specimen (male, age: 53 years, weight: 115 kg, height: 183 cm) resected at the mid-diaphyseal level of the humerus. Ethical approval for the use of this specimen was obtained from the Tissue
Musculoskeletal Geometry

A 6-camera optical motion capture system (Oqus 5+, residual error < 0.3 mm, Qualisys, Sweden) was used to track the positions of eight clusters, each comprised of three markers (Fig. 1), and a digitisation wand, comprised of five markers. Owing to the technical challenges of simultaneously tracking all 22 segments, the clusters were designed to be mounted and dismounted on different segments. An M4 ball and spring plunger system ensured accurate and repeatable cluster placement. A digitisation wand was used to digitise anatomical points, lines and surfaces on the specimen (error < 0.45 mm, as determined during the wand calibration).

Initial dissection included the excision of skin, fat and connective tissues to reveal the bone surface to which the cluster bases were affixed. The bases were secured to each segment with self-tapping wood screws and care was taken to not impinge any tendons or ligaments. Six static trials were initially recorded, one for the forearm and one for each finger, to define a reference pose where the position of all clusters was known. The third metacarpal (MC3) cluster was used as the reference coordinate system. The error associated with the transformations of the marker clusters to the reference posture was less than 0.2 mm. All geometrical measurements presented correspond to this reference pose and are expressed in the anatomical coordinate system of the left ulna.

Bony landmarks were digitized directly on the skin of the forearm and hand to define coordinate systems for all segments. The joints were passively moved through uniaxial motions to estimate the location and orientation of functional axes using the instantaneous helical axis method. The specimen was then dissected progressively to enable the digitisation of the origin, insertion and via points, representing the path of each muscle/tendon. Via points were digitised to describe more precisely the paths of the tendons between their origin and insertion points. These points were especially chosen to represent the paths of tendons when crossing a joint, e.g., entrance and exit to retinaculum, and to characterize the interconnection between finger tendons, e.g., extensors. After the dissection, the wand was used to digitise dorsal surfaces of the finger joints about which the tendons wrapped. Simple geometrical shapes, i.e., cylinders or spheres, were fit to these traces to further constrain the tendon paths in the resultant musculoskeletal model.

Muscle Morphological Parameters

After dissection, each muscle/tendon unit was transfixed to a wooden board and fixated in a 4% formalin solution. The muscle belly length, fibre length, tendon length and pennation angle were measured using a metal ruler and protractor. Depending on the size of the muscle, 2–5 readings of fibre length and pennation angle were taken at different locations; these were averaged to obtain a single value for each muscle. The tendons were carefully resected off the musculotendinous junctions to measure muscle mass using a digital scale (accuracy: 0.1 g).

To obtain the optimal muscle fibre length of each muscle, the sarcomere length of the muscle in its fixated state was measured using digital microscopy. For each muscle, two fibre samples (10–50 fibres, 2 cm long), one close to the origin of the fibres and one close to the insertion, were dissected and conserved in a 50% glycerol solution. From each sample, smaller samples consisting of 1–5 fibres were obtained under a dissection microscope (EZ4D, Leica Microsystems, UK) at 35 times magnification; these were mounted onto glass slides using glycerol solution and a glass cover slide. Digital images (257 µm at 500 times magnification) of these fibre samples were taken using a camera (Axiocam ICc 1, Zeiss, Germany) mounted on a light microscope (Axiocope.A1, Zeiss, Germany). Each image was processed in MATLAB (The Mathworks, Natick, MA) using a custom-written programme to calculate the sarcomere length. Images were converted to greyscale format to obtain the intensity profile along a manually drawn line, parallel to the fibre. Maximal intensity peaks were detected and used to count the number of sarcomeres in the profile (mean 38.7 ± 11.1) and calculate the sarcomere length. The final sarcomere length of a muscle was obtained by averaging the estimations obtained for all the images taken for that muscle (between 5 and 17). The ratio of the final sarcomere length to the optimal sarcomere length of 2.7 µm was used to scale the muscle fibre length to obtain the optimal fibre length.
The physiological cross-sectional area (PCSA) of each muscle was calculated using the equation

\[ \text{PCSA}_m = \frac{m_m}{\rho_m \cdot l_f} \]  

where \( m_m \) is the muscle mass, \( \rho_m \) the muscle density, assumed to be 1.056 g cm\(^{-3}\), and \( l_f \) the optimal fibre length.

**Bone Surfaces**

Prior to its dissection, the specimen was scanned using computed tomography (CT; SOMATOM Definition AS, SIEMENS, Germany; in-plane resolution = 0.63 mm, slice thickness = 1 mm). 3D surface models of the bones were obtained after segmentation and smoothing operations (MIMICS, Materialise, Leuven, Belgium).

**Wrist Musculoskeletal Model**

A musculoskeletal model of the wrist was created based on the anatomical dataset. The wrist was modeled as two hinge joints between the radius and MC3, one representing radial–ulnar deviation and one representing flexion–extension. The axes were oriented and positioned identically to the corresponding functional axes (Table 4), as determined using the passive joint motion data (see “Musculoskeletal geometry” section). The joint centre of rotation was assumed to be the point at the intersection of the flexion–extension axis and the plane parallel to the sagittal plane of the radius, defined using ISB definitions, and containing the midpoint between the radial and ulnar styloids (Fig. 2a). Only the prime movers of the wrist, i.e., those muscles inserting on the metacarpals, were considered: flexor carpi ulnaris (FCU), flexor carpi radialis (FCR), palmaris longus (PL), extensor carpi ulnaris (ECU), extensor carpi radialis longus (ECRL), extensor carpi radialis brevis (ECRB) and abductor pollicis longus (APL).

**Tendon Path**

In addition to the origin, insertion and via points for each muscle, wrapping objects were created to constrain muscle/tendon paths. Each path was constrained by two cylinders (Fig. 2b), one representing the carpal bones and the other representing the retinaculum. All cylinders were fixed relative to the radius, with their axis parallel to the wrist flexion–extension axis. Their position along the radius longitudinal and antero-
posterior axes, and the their radii, were manually adjusted to obtain both physiologically realistic trajectories, and tendon excursion and moment arm curves consistent with the literature.4,14,18

The paths and lengths of the tendon elements were then calculated using the shortest path method.8 The line of action for each muscle was represented by a unit vector directed from the insertion point to either a via point proximal to the wrist or to the most distal point wrapping on a cylinder. Moment arms for each tendon about the wrist joint were calculated as the cross-product between the unit vector and the vector going from the wrist joint centre to the insertion point.

Estimation of Muscle Forces

The forces exerted by the seven muscles were estimated by solving the moment mechanical equilibrium about the two degrees of freedom of the wrist. Since the system is indeterminate, i.e., more unknowns than equations, there are an infinite number of muscle force combinations to balance the moments at the wrist. An optimisation procedure based on the minimisation of muscle stress10 was therefore used to select a solution. The direction of the joint reaction force was also constrained in order to avoid unrealistic estimations,6 such as those resulting in a dislocation of the wrist. This optimisation was implemented as follows:

For each time sample, find \( f_m \) that minimizes

\[
g(f_m) = \sum_m \left( \frac{f_m}{PCSA_m} \right)^2
\]

and subject to

\[
[I_h]\vec{\theta} = \vec{M}_p + \vec{M}_e + \sum_m \vec{r}_m f_m
\]

\[
0 \leq f_m \leq PCSA_m \cdot \sigma_{\text{max}}
\]

\[
\alpha_{\text{min}} \leq \arctan \left( \frac{\vec{R}_j \cdot \vec{x}_{\text{radius}}}{\vec{R}_j \cdot \vec{y}_{\text{radius}}} \right) \leq \alpha_{\text{max}}
\]

\[
\beta_{\text{min}} \leq \arctan \left( \frac{\vec{R}_j \cdot \vec{x}_{\text{radius}}}{\vec{R}_j \cdot \vec{y}_{\text{radius}}} \right) \leq \beta_{\text{max}},
\]

where \( f_m \) is the muscle force of muscle \( m \), PCSA\(_m\) the physiological cross-sectional area of muscle \( m \), \([I_h]\) the inertia matrix of the hand at the wrist joint centre, \( \vec{\theta}(t) \) the angular acceleration of the hand centre of mass, \( \vec{M}_p \) the moment due to passive constraints in the wrist joint, \( \vec{M}_e \) the moment due to the external forces applied to the hand, \( \vec{r}_m \) the moment arm vector of muscle \( m \), \( \sigma_{\text{max}} \) the maximum muscle stress, \( \vec{R}_j \) the joint reaction force at the wrist, \( \vec{x}_{\text{radius}} \), \( \vec{y}_{\text{radius}} \), and \( \vec{z}_{\text{radius}} \) are the local coordinate system axes the radius calculated as recommended by the ISB.29 \( \alpha_{\text{min}}, \alpha_{\text{max}}, \beta_{\text{min}}, \) and \( \beta_{\text{max}} \) are the angles used to constrain the components of the joint reaction force corresponding to shear forces; these were equal to 30° (dorsal), 60° (palmar), 85° (radial), and 30° (ulnar direction), respectively. These values were determined using the position of joint surfaces in the bone surface models. The joint reaction force was calculated using the equation

\[
m_h : \vec{a}_h = \vec{F}_e + \sum_m \vec{u}_m f_m + \vec{R}_j,
\]

where \( m_h \) is the mass of the hand, \( \vec{a}_h \) the acceleration of the hand centre of mass, \( \vec{F}_e \) the resultant force due to the external forces applied to the hand, \( f_m \) and \( \vec{u}_m \) the muscle force and the unit vector describing the line of action of muscle \( m \), \( \vec{R}_j \) the joint reaction force vector.

The PCSAs were taken directly from the morphological muscle parameters measured for the dissected specimen and a maximum muscle stress value of 35 N cm\(^{-2}\) was used to calculate the maximal isometric force of each muscle.13,25

The inertial parameters of the hand, i.e., the moments of inertia, the mass and the centre of mass position, were obtained using regression equations,30 employing the hand dimensions of the dissected specimen. The inertia matrix was calculated at the wrist joint centre using the Huygens-Steiner theorem. The position of the centre of mass was constrained to lie on the longitudinal axis of the MC3, defined by the location of the wrist and third metacarpophalangeal joint centres.

The resistive moment due to passive contributions was defined as a function of joint angle28

\[
M_p = -k_p \cdot \theta + \frac{M_{p_{\text{max}}}}{\exp\left(\frac{\bar{\epsilon}_p}{\theta_{\text{max}}}\right) - 1},
\]

where \( M_{p_{\text{max}}} \) is the maximal passive moment, \( \theta_{\text{max}} \) the joint angle at which the maximal passive moment occurs, \( k_p \) the linear stiffness, \( \bar{\epsilon}_p \) the shape parameter for the non-linear elastic component. Four relationships were defined, one for each direction of motion in the two degrees of freedom. The parameters of each of these four equations were manually adjusted (Table 1) to agree with wrist passive moment data measured by Delp et al.11

Alternative Versions of the Model

To illustrate the effect of combining different data-sets in the same musculoskeletal model, two alternative versions of the model were also tested, one where PCSAs were taken from Chao et al.,7 and another
where moment arms were calculated directly from joint angles using polynomial regressions of Lemay and Crago.\textsuperscript{15}

**Model Evaluation and Simulations**

The model was evaluated by comparing excursion and moment arm values with those reported from cadaver studies.\textsuperscript{4,14} The model was used to estimate muscle forces during a flexion–extension cycle of 1 s with the joint angle following a sine wave starting and finishing at 0° with maximal flexion and extension of 70°. To analyse the effect of the direction of gravity on the muscle forces, this motion was simulated with the forearm placed horizontally in two different positions—the ‘palm down’ position (gravity vector in the palmar direction) and the ‘thumb-up’ position (gravity vector in the ulnar direction).

**RESULTS**

**Anatomical Dataset**

In total, the anatomical dataset includes 52 landmarks, 233 muscle points, 24 functional axes as well as the morphological parameters of 48 muscles and muscle bellies. For brevity, only the data used in the wrist musculoskeletal model are presented herein (Tables 2, 3, 4, 5, and 6). However, the entire dataset is accessible within the supplementary materials.
The PCSAs and optimal fibre lengths measured for the wrist muscles are shown on Fig. 3, together with data from previous studies.\(^1,7,16\) PCSA values measured in the current study ranged from 1.5 cm\(^2\) for PL to 8.9 cm\(^2\) for ECU and were comparable with literature values. Only the PCSA of the extensors, i.e., ECU, ECRL and ECRB, were higher, up to 140\% for ECU, than in previous studies. Fibre lengths ranged from 8.6 cm for ECRL to 4.5 cm for ECU and were also comparable with literature values. The fibre lengths of the flexors, i.e., FCU, FCR and PL, were higher, up to 60\% for FCU, than in previous studies.

Musculoskeletal Model of the Wrist

The parameters of the cylinders constraining the paths of the tendons are given in Table 7.

The tendon excursion-joint angle relationships estimated with the model in both flexion–extension and radial–ulnar deviation are shown in Fig. 4, together with experimental measurements from a previous study.\(^14\) Over the 100° range of flexion–extension, the total excursions ranged, in absolute value, between 6.4 mm for ECU and 33.2 mm for FCU. The largest differences between model predictions and experimental values were observed for FCU (4.4 mm; + 24\%) and ECU (4.09 mm; − 39\%). Over the 30° range of radial–ulnar deviation, the total excursions ranged, in absolute value, between 4.9 mm for FCR and 13.8 mm for ECRL. The greatest differences between model predictions and experimental values were observed for ECRB (3 mm; + 53\%) and FCU (1.7 mm; − 23\%).

The tendon moment arm-joint angle relationships obtained with the model are shown on Fig. 5, together

Table 4. Orientation of the functional axis and location of a point on the axis for flexion–extension (FE) and radial–ulnar deviation (RUD) of the wrist expressed in the ulna coordinate system\(^29\) in the reference posture.

| Motion | Axis | Point | X (mm) | Y (mm) | Z (mm) | \(\delta\) (°) |
|--------|------|-------|--------|--------|--------|-------------|
| FE     | \(X\) | \(-0.971\) | \(-0.227\) | \(-0.082\) | \(43.229\) |
|        | \(Y\) | 0.155 | 0.987 | 13.8 | 38.585 |
| RUD    | \(X\) | 0.300 | 0.227 | 0.082 | 8.4 |
|        | \(Y\) | 0.071 | 0.155 | 0.987 | 13.8 |

The average variation in direction (\(\delta\)) and position (\(\Delta\)) of the instantaneous helical axes compared to the functional axis were calculated as in Veeger \etal.\(^26\)

Table 5. Location of muscle origin, insertion and via points for the flexor carpi ulnaris (FCU), flexor carpi radialis (FCR), palmaris longus (PL), extensor carpi ulnaris (ECU), extensor carpi radialis longus (ECRL), extensor carpi radialis brevis (ECRB) and abductor pollicis longus (APL) used in the musculoskeletal model of the wrist expressed in the ulna coordinate system\(^29\) in the reference posture.

| Muscle      | Point | Segment | X (mm) | Y (mm) | Z (mm) |
|-------------|-------|---------|--------|--------|--------|
| FCU         | O1    | HUM     | 0.7    | 285.7  | 30.7   |
|             | I     | MC3     | 19.2   | −16.9  | 19.8   |
| FCR         | O     | HUM     | 7.7    | 298.7  | 26.1   |
|             | via   | RAD     | 40.6   | 14.6   | 18.0   |
|             | I     | MC3     | 52.5   | −33.5  | −2.8   |
| PL          | Op    | HUM     | 9.4    | 306.1  | 27.2   |
|             | via2  | MC3     | 35.3   | −30.7  | 17.3   |
|             | I2    | MC3     | 44.1   | −85.9  | −0.7   |
| ECU         | Op*   | HUM     | −8.2   | 281.0  | −25.3  |
|             | via1  | RAD     | 5.9    | 26.8   | −3.5   |
|             | I     | MC5     | 8.2    | −27.0  | −6.6   |
| ECRL        | Op    | HUM     | 36.9   | 327.8  | −24.8  |
|             | via   | RAD     | 54.2   | 27.8   | −0.9   |
|             | I     | MC2     | 57.9   | −32.0  | −14.3  |
| ECRB        | Op    | HUM     | 13.7   | 304.8  | −32.1  |
|             | via   | RAD     | 46.9   | 23.9   | −3.4   |
|             | I     | MC3     | 49.7   | −25.7  | −20.5  |
| APL         | Op    | ULN     | −3.1   | 232.5  | −0.1   |
|             | via1  | RAD     | 60.0   | 13.3   | 8.9    |
|             | I     | MC1     | 79.5   | −19.7  | 4.3    |

“O”, “via” and “I” designate origin, via and insertion points, respectively. “p” designates the most proximal point of the origin or insertion area.

* Designates the middle point of the area of the origin or insertion. When several origins, via or insertion points could be identified, a number was added at the end of the point name, e.g., O1. The point names in this table refer to those of the complete dataset, available as supplementary materials.
with experimental data previously reported in the literature. The flexion–extension moment arms estimated by the model ranged, in absolute values, from 3.0 mm for ECU to 29.5 mm for PL. The greatest differences between the model and literature values were 4.7 mm (+ 85%) for APL when compared to Brand and Hollister, and 8.6 mm (+ 64%) and 6.3 mm (+ 40%) for FCU when compared to Horii et al. and Loren et al., respectively. The moment arms in radial–ulnar deviation estimated by the model ranged, in absolute values, from 7.2 mm for FCR to 30.9 mm for APL. The largest differences between the model and literature values were 9.5 mm (+ 95%) and 10.8 mm (+ 115%) for ECRB when compared to Brand and Hollister, and Horii et al., respectively.

The muscle forces estimated by the initial musculoskeletal model during the simulated flexion–extension motion in the two tested positions showed comparable trends, but resulted in different muscle load sharing and force intensities (Figs. 6 and 7). In the palm-down position, the flexors were active during less than half of the cycle, and for less than a quarter of the cycle for PL and FCR. They reached their maximal force, up to 25.2 N for FCR, at 0.25 s, i.e., when the wrist was at 70° of flexion, with the exception of FCU, which reached its maximum force of 62.6 N at 0.75 s. The extensors were active during more than three quarters of the cycle and were all inactive in the interval between 0.2 and 0.3 s; their force was maximal, up to 90.0 N for ECRL, at 0.75 s, i.e., when the wrist was at 70° of extension. In the thumb-up position, some flexors were active during more than three quarters of the cycle. Their forces were maximal at 0.25 s for PL and FCR (3.3 and 35.8 N, respectively), at 0.63 s for APL (5.4 N), and at 0.75 s for FCU (75.1 N). During this same motion, ECRB and ECRL were active for more than 80% of the cycle, whereas ECU was active for less than half of the motion. The forces of the three extensors were all maximal at 0.75 s, with up to 59.3 N for ECRL.

Compared to the initial model, the two alternative versions of the model resulted in different patterns of muscle forces and muscle load sharing. The use of PCSAs from the literature particularly modified the load sharing between the extensors. During the palm-down motion, ECRL and ECU forces were reduced by up to 82 and 40%, respectively, and ECRB force was increased by up to 179% at 0.75 s of the cycle. During the thumb-up motion, similar modifications were observed; ECRL and ECU were decreased by up to 52 and 38%, respectively, and ECRB was increased by up to 141% at 0.75 s. Using the PCSAs from the literature, FCU was the only flexor for which muscle force was affected, with increases of up to 33% and

| Muscle         | Mass (g) | PCSA (cm²) | Pennation angle (°) | Belly length (mm) | Fibre length (mm) | Index of architecture | Tendon length (mm) |
|----------------|----------|------------|---------------------|-------------------|-------------------|-----------------------|-------------------|
| FCU            | 62.1     | 7.3        | 35                  | 394               | 81                | 0.20                  | 239               |
| FCR            | 32.3     | 3.9        | 18                  | 251               | 78                | 0.31                  | 209               |
| PL             | 12.0     | 1.5        | 35                  | 206               | 76                | 0.37                  | 239               |
| ECU            | 42.4     | 8.9        | 35                  | 255               | 45                | 0.18                  | 249               |
| ECRL           | 55.1     | 6.1        | 42                  | 163               | 86                | 0.53                  | 234               |
| ECRB           | 41.9     | 6.2        | 33                  | 182               | 64                | 0.35                  | 217               |
| APL            | 18.6     | 3.0        | 29                  | 212               | 58                | 0.27                  | 169               |

FIGURE 3. Physiological cross-sectional areas (PCSAs) and fibre lengths from the current study and as reported in the literature (mean ± SD) for the flexor carpi ulnaris (FCU), flexor carpi radialis (FCR), palmaris longus (PL), extensor carpi ulnaris (ECU), extensor carpi radialis longus (ECRL), extensor carpi radialis brevis (ECRB) and abductor pollicis longus (APL). From lightest to the darkest shade, the values were taken from Chao et al., An et al., and Lieber et al.
40% in both the palm-down and thumb-up, respectively. Using moment arms from the literature, the load sharing between both flexors and extensors was modified. In both motions, this model resulted in modified muscle load sharing of the flexors on the interval between 0.15 and 0.35 s with the FCU force being increased by up to 182% and the FCR force being decreased by up to 55%. During the palm-down motion, the extensors were particularly affected in the interval between 0.35 and 0.65 s of the cycle, with ECU and ECRB forces being reduced by up to 40 and 20%. During the thumb-up motion, although muscle force intensities were not modified greatly, ECRL was active throughout the trial, including between 0.20 and 0.30 s, which was not the case with the initial model.

**DISCUSSION**

A large anatomical dataset was collected to provide a quantified representation of the musculoskeletal system from the elbow to the tip of the five fingers for musculoskeletal modelling of the hand and the wrist. Motion capture, muscle fixation and clinical imaging were combined to characterize the musculoskeletal geometry, the muscle morphology, and the bone surfaces of a single specimen. The collection protocol followed the one described in Mirakhorlo et al., who completed a similar study and also provided an anatomical dataset. Compared to this previous study, the specimen dissected here was male, younger, and larger in terms of anthropometry. In addition, the present dataset also provides clinical imaging (both CT and MRI) which was not available with the previous study. Finally, simple geometrical shapes were proposed here to constrain the paths of tendons at the wrist, which was not available previously.

A musculoskeletal model of the wrist, with two degrees of freedom, actuated by seven muscles, was developed to estimate muscle forces and demonstrate the potential of the collected dataset. The comparison of the model’s outputs with direct cadaveric measurements showed that using two cylinders to constrain the tendon paths was sufficient to obtain functionally realistic results. The tendon excursions in the model, calculated using the two-cylinder approach (Fig. 2b), were in good agreement with cadaveric experimental curves (Fig. 4). The comparison of moment arms in the model with those measured functionally on cadavers showed that the distribution across muscles were in relatively good agreement but that the shapes of the curves occasionally differed (Fig. 5). The general discrepancies between modelled and experimental values in radial–ulnar deviation can be explained by the fact that the two-cylinder approach predominantly constrains the tendon paths during flexion–extension. Nevertheless, the curves taken from

| TABLE 7. Parameters of cylinders used to constraint the tendon paths in the musculoskeletal model for flexion (flex) and extension (ext) of the wrist for the flexor carpi ulnaris (FCU), flexor carpi radialis (FCR), palmaris longus (PL), extensor carpi ulnaris (ECU), extensor carpi radialis longus (ECRL), and extensor carpi radialis brevis (ECRB) and abductor pollicis longus (APL). |
| --- | --- | --- | --- | --- |
| Point | X | Y | Z | Radius |
| FCU | Cylinder 1 (flex) | 25.9 | -256.9 | 50.2 | -0.971 | -0.227 | -0.081 | 4.0 |
| | Cylinder 2 (ext) | 30.3 | -273.2 | 33.3 | -0.971 | -0.227 | -0.081 | 12.0 |
| FCR | Cylinder 1 (flex) | 28.8 | -269.1 | 50.8 | -0.971 | -0.227 | -0.081 | 2.5 |
| | Cylinder 2 (ext) | 31.3 | -277.9 | 34.9 | -0.971 | -0.227 | -0.081 | 12.0 |
| PL | Cylinder 1 (flex) | 25.3 | -254.7 | 55.9 | -0.971 | -0.227 | -0.081 | 5.0 |
| | Cylinder 2 (ext) | 29.9 | -272.0 | 35.6 | -0.971 | -0.227 | -0.081 | 15.0 |
| ECU | Cylinder 1 (flex) | 30.3 | -273.8 | 36.9 | -0.971 | -0.227 | -0.081 | 10.0 |
| | Cylinder 2 (ext) | 29.5 | -269.3 | 25.7 | -0.971 | -0.227 | -0.081 | 1.5 |
| ECRL | Cylinder 1 (flex) | 30.9 | -275.5 | 30.6 | -0.971 | -0.227 | -0.081 | 10.0 |
| | Cylinder 2 (ext) | 29.6 | -269.2 | 20.6 | -0.971 | -0.227 | -0.081 | 1.5 |
| ECRB | Cylinder 1 (flex) | 30.8 | -275.0 | 27.0 | -0.971 | -0.227 | -0.081 | 10.0 |
| | Cylinder 2 (ext) | 29.0 | -266.2 | 18.7 | -0.971 | -0.227 | -0.081 | 1.5 |
| APL | Cylinder 1 (flex) | 29.1 | -269.0 | 39.7 | -0.971 | -0.227 | -0.081 | 1.0 |
| | Cylinder 2 (ext) | 30.7 | -275.1 | 34.0 | -0.971 | -0.227 | -0.081 | 5.0 |

The point coordinates and the radii are provided in mm.
Cadaveric studies are mean curves and therefore are representative of trends in a population, whereas the model represents a single specimen. Furthermore, none of these studies provided a measure of the inter-subject variations; therefore, although the curves of the model diverged from those of the literature, they might remain within a physiological range of the mean curves. Finally, the anthropometry of the specimens in those previous studies was not provided; therefore, it is not possible to normalize the moment arms and remove any size effects in the comparisons.

The muscle forces estimated by the model during the two simulated motions were consistent with the mechanical constraints of the motion and included estimations of co-contraction (Figs. 6 and 7). The muscles that were most activated throughout the flexion–extension cycle were the extensors in the palm-down position and the radial deviators in the thumb-up position. This is explained by the fact that these muscle groups were the ones balancing the action of gravity on the hand, which resulted in a flexion moment in the palm-down position and an ulnar moment in the thumb-up position. In both positions, most of the flexors and the extensors reached their maximal muscle force at the times corresponding to the maximal flexion angle and the maximal extension angle, respectively. This is consistent with the development of contributions from passive structures, which created a resistive moment that increased exponentially when approaching the limits of the range of motion and ultimately outweighed the hand acceleration moment. More interestingly, in the interval where extension angle was maximal, i.e., around 0.75 s, the model estimated a co-contraction of both FCU and APL muscles. This co-contraction was due to the constraint on the direction of the joint reaction force, preventing unrealistically high shear components. This result is encouraging because the estimation of co-contraction using musculoskeletal modelling is difficult and often requires the use of electromyography to guide the choice of a solution in the muscle load sharing problem.

However, in other parts of the trial, only one muscle group is involved, e.g., extensors in the palm-down position, which might seem unrealistic. Unfortunately, because of the lack of data regarding muscular activity and loading of the forearm muscles during simple wrist tasks, it is difficult to fully validate the muscle force and co-contraction levels estimated by the model. However, the tendon excursion and moment arms estimated by the model were consistent with experimental data giving confidence that the model is realistic.

The two alternative versions of the model that combined data collected in the present study with average data previously reported in the literature markedly modified the muscle force levels and the muscle load sharing predicted by the model (Figs. 6 and 7). Using average PCSAs particularly modified the load sharing between the extensors. This could be expected since the PCSAs of extensors were markedly larger in the current study whereas those of flexors were closer to literature data (Fig. 3). The muscle stress criteria (Eq. 2) chooses a muscle load sharing solution to optimise the contribution of each muscle according to its PCSA, reflecting its maximal force capacity. Therefore, if a given muscle is assigned a larger PCSA,
the optimisation will try to reduce the contribution of
that muscle. In general, the variations in and distri-
bution of these parameters, are probably due to dif-
ferences in terms of age or anthropometry between the
specimen dissected in this study and the populations
considered in the previous studies. Using polynomial
regressions\textsuperscript{15} to calculate moment arms
affected the flexors more strongly, for example the FCU force
increased by up to 182\%, with some variations in the
load sharing of the extensors. As with PCSAs, the
distribution of moment arms across the muscles di-
rectly impacts muscle load sharing since it represents
how much each muscle can contribute to balance the
resultant moment at the joint (Eq. 3). Although the
moment arms in the initial model were globally close to
those of Brand and Hollister\textsuperscript{4} (Fig. 5), this modifica-
tion influenced the muscle force estimations. More
importantly, the regression equations taken from the
literature assumed the moment arm about an axis
varies only with the joint angle about that same axis
and thus neglected the fact that each moment arm
component depends on the posture of the joint, which
is described by two joint angles for the wrist. Using 3D
coordinates of the tendon via points in combination
with geometrical constraints, as in the initial model,
represents a more realistic representation of the joint
biomechanics. The two alternative versions of the
model demonstrated how much the combination of
different datasets within a same model can markedly
influence the predicted muscle load sharing, and con-
firmed the importance of using the same source of data
for musculoskeletal geometry and muscle morphology.

Several limitations should be considered regarding
the results of the present study. Regarding the dataset,
the parameters provided herein describe the muscu-
loskeletal geometry and muscle morphology of a single
specimen and might be inadequate to represent the
anatomy of some subjects. Further studies should

\begin{figure}[h]
\centering
\includegraphics[width=\textwidth]{figure5.png}
\caption{Comparison of moment arm-joint angle relationships with the experimental data reported in different studies for flexion–extension (FE; upper panels) and radial–ulnar deviation (RUD; lower panels) for the flexor carpi ulnaris (FCU), flexor carpi radialis (FCR), palmaris longus (PL), extensor carpi ulnaris (ECU), extensor carpi radialis longus (ECRL), extensor carpi radialis brevis (ECRB) and abductor pollicis longus (APL). Experimental data was taken from Brand and Hollister\textsuperscript{4} in left panels, Horii et al.\textsuperscript{14} in middle panels, Loren et al.\textsuperscript{18} in right panels.}
\end{figure}
therefore investigate how to personalize these parameters so that the dataset can be used to model participants presenting different anthropometries or different muscle force capacities. Furthermore, the bone surfaces obtained from the clinical imaging were manually registered to match the data measured with motion.
capture during the dissection. Automated registration may have been possible if the clusters were affixed to the specimen prior to imaging, but this would have required dissection prior to the scans, which would have complicated the scanning protocol. In addition, a greater number of scans would have been required, as

**FIGURE 7.** Muscle forces estimated with different versions of the model during the simulated flexion–extension (FE) cycle in the thumb-up position for the flexor carpi ulnaris (FCU), flexor carpi radialis (FCR), palmaris longus (PL), extensor carpi ulnaris (ECU), extensor carpi radialis longus (ECRL), extensor carpi radialis brevis (ECRB) and abductor pollicis longus (APL). The last three lower panels present the results of, from top to bottom, the initial model, the model using physiological cross-sectional area (PCSA) values from Chao et al.\(^7\) and the model using moment arm-angle relationships from Lemay and Crago.\(^{15}\)
clusters could not be placed on all the fingers at once. More generally, despite the quality and quantity of data provided in the present study, the users of this dataset should bear in mind that it faces inherent limitations related to all cadaveric experiments. For instance, the parameters provided might vary with joint motions or muscle contraction levels, e.g., muscle morphological parameters and positions of the tendons relative to the bones. Considering the high number of muscles tested, investigating such variations would have drastically increased the time of the dissection, detrimentally affecting the integrity of the tissues. However, we are confident that the quantitative dataset provided in this study represents a reliable reference to design models of the musculoskeletal system of the hand and the forearm.

The action of hand extrinsic muscles at the wrist was not included in the model. Although this might have influenced the muscle load sharing predicted by the model, adding these muscles would have necessitated the inclusion of the degrees of freedom at the finger joints, as well as the actions of the intrinsic hand muscles at those joints. However, our intentions were to demonstrate the potential of the dataset using a relatively simple musculoskeletal model of the wrist, and to illustrate the consequences of combining datasets.

In conclusion, the anatomical dataset provided here will enable the development of a complex model of the musculoskeletal system of the hand and wrist, from the elbow to the tips of the fingers. The wrist musculoskeletal model presented herein demonstrated that the dataset can provide physiologically realistic estimations of tendon excursions and moment arms and can be further used to predict muscle forces during simple motions. This large dataset can be used to develop and improve musculoskeletal models of the hand, and therefore, ameliorate the predictions of the geometrical and biomechanical behaviour of the hand structure. This could facilitate the quantitative assessment of hand internal biomechanics and therefore, improve ergonomics, rehabilitation and the prevention of musculoskeletal disorders.

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