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## **A BATTERY OF STRENGTH TESTS FOR EVIDENCE-BASED CLASSIFICATION IN PARA SWIMMING**

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# **A BATTERY OF STRENGTH TESTS FOR EVIDENCE-BASED CLASSIFICATION IN PARA SWIMMING**

## **ABSTRACT**

This study examined the validity of isometric strength tests for evidence-based classification in Para swimming. Thirty non-disabled participants and forty-two Para swimmers with physical impairment completed an isometric strength test battery designed to explain activity limitation in the freestyle discipline. Measures pertaining to dominant and non-dominant limb strength and symmetry were derived from four strength tests that were found to be reliable in a cohort of non-disabled participants (ICC = 0.85-0.97; CV = 6.4-9.1%). Para swimmers had lower scores in strength tests compared with non-disabled participants ( $d = 0.14-1.00$ ) and the strength test battery successfully classified 95% of Para swimmers with physical impairment using random forest algorithm. Most of the strength measures had low to moderate correlations ( $r = 0.32$  to  $0.53$ ;  $p \leq 0.05$ ) with maximal freestyle swim speed in the cohort of para swimmers. Although, fewer correlations were found for both groups when Para swimmers with hypertonia or impaired muscle power were analysed independently, highlighting the impairment-specific nature of activity limitation in Para swimming. Collectively, the strength test battery has utility in Para swimming classification to infer loss of strength in Para swimmers, guide minimum eligibility criteria, and to define the impact that strength impairment has on Para swimming performance.

## 20 INTRODUCTION

21 Classification plays an integral role in Paralympic sport and aims to promote increased  
22 participation in sport by people with disabilities by minimising the impact that impairment  
23 has on the competition outcome. Para swimming, one of the most popular Paralympic sports,  
24 uses a functional classification system to group athletes with an eligible physical impairment.  
25 Unfortunately, studies have shown current classification methods fail to delineate  
26 performance between some classes and disadvantage athletes with certain types of physical  
27 impairment within classes (Burkett et al., 2018; Daly & Vanlandewijck, 1999; Wu & Williams,  
28 1999). The shortcomings of the current classification system may result, at least in part, from  
29 issues with measurement weighting and aggregation stemming from a lack of understanding  
30 of the relationship between impairment and swimming performance (Tweedy, Beckman, &  
31 Connick, 2014). World Para swimming have mandated that research be conducted to provide  
32 the scientific evidence to underpin a new classification system in Para swimming  
33 (International Paralympic Committee, 2015).

34 A key step towards evidence-based classification systems in Para sport is developing valid  
35 tests of impairment and establishing their relationship with sports performance. It is  
36 important to note that these tests do not directly measure impairment, but infer impairment  
37 based on knowledge of intact, unimpaired body structures and functions (Tweedy, Mann, &  
38 Vanlandewijck, 2016). Their purpose is to describe Para athletes' type, location and severity  
39 of impairment to estimate their subsequent activity limitation for a given sporting event. The  
40 International Paralympic Committee (IPC) Position Stand stipulates that valid impairment  
41 tests will have several measurement properties (Tweedy & Vanlandewijck, 2011). These  
42 include impairment tests being precise and reliable, ratio-scaled, specific to the impairment  
43 of interest, quantitative, account for a significant portion of variance in performance, and as  
44 training resistant as possible.

45 Muscular strength and power are key determinants of success in competitive swimming and  
46 their importance to propulsion during swimming is widely accepted (Crowley, Harrison &  
47 Lyons, 2017; Loturco et al., 2016). Para swimmers with health conditions such as spinal cord  
48 injury, cerebral palsy and Charcot-Marie-Tooth disease have impairments to the central and  
49 peripheral nervous systems, musculoskeletal system or links between these structures, that  
50 result in loss of muscular strength and power and affect their swimming performance  
51 (Dingley, Pyne, & Burkett, 2014; Dingley, Pyne, Youngson & Burkett, 2015; Morouco et al.,  
52 2011). Classifying strength impairment of Para swimmers with motor-complete spinal cord  
53 injury is relatively straightforward as these athletes have a non-progressive loss of voluntary  
54 motor control that corresponds to the level of lesion (Connick et al., 2018). Other progressive  
55 and non-progressive medical conditions such as cerebral palsy, motor-incomplete spinal cord  
56 injury, polio, and Charcot-Marie-Tooth disease have inconsistent clinical manifestations.  
57 Para swimmers with these conditions have loss of voluntary motor control that varies  
58 considerably for the severity of impairment and its presentation in the trunk, and upper and  
59 lower limb extremities.

60 Manual Muscle Testing (MMT) techniques are currently used to assess the severity and  
61 location of impairment by subjectively inferring swimmers' loss of strength by rating whether  
62 they can produce what is termed 'normal' resistance around joints (International Paralympic  
63 Committee, 2017). Although having several advantages, including being easy to administer,  
64 widely utilised in clinical practice and inexpensive, MMT techniques lack key measurement  
65 properties required for evidence-based classification. Inter- and intra-tester reliability is poor  
66 due to the subjective assessment of muscle strength and the ordinal measures derived from  
67 MMT are limited in defining their relationship with sporting performance (Beckman, Connick,  
68 & Tweedy, 2017; Bohannon, 2005).

69 Guidelines have recently been published for the development of instrumented tests of  
70 muscle strength for the purposes of classification (Beckman, Connick & Tweedy, 2017). The  
71 key recommendations were to develop isometric measures of muscle strength that assess  
72 Para athletes' force generating capacity in multi-joint positions that are standardised and  
73 specific to the sport of interest. Such tests will provide the most valid measures for inferring  
74 loss of muscle strength for classification as they determine the maximal force generating  
75 capacity of a muscle or muscle group (Cormie, McGuigan, & Newton, 2011), are more likely  
76 to be resistant to training than dynamic muscular strength and power tests that typically  
77 have greater specificity to athletic performance (Beckman et al., 2017; Loturco et al., 2016),  
78 and might have strong and meaningful associations with sports performance in Para athletes  
79 with strength impairment (Beckman, Connick & Tweedy, 2016; Hyde et al., 2017).

80 As isometric strength tests are limited in assessing muscular strength through full range of  
81 motion, important steps in developing tests for classification include identifying the principal  
82 muscle groups and actions that are involved in the sport (Beckman et al., 2017; Burkett et al.,  
83 2017). Most studies in able-bodied swimmers have investigated front crawl swimming and  
84 have reported the latissimus dorsi, pectoralis major, and teres minor play important roles in  
85 stabilising and mobilising the shoulder into extension and adduction during the early and late  
86 underwater pull phases that are primarily responsible for propulsion (Amaro, Morouco,  
87 Marques, Fernandes & Marinho, 2017; Martens, Figueiredo & Daly, 2015). Agonist  
88 antagonist activity of muscles of the elbow joint (i.e. biceps brachii and triceps brachii) and  
89 wrist joint (i.e. brachioradialis, flexor carpi ulnaris, and extensor carpi ulnaris) stabilise the  
90 forearm and hand to overcome water drag during these propulsive actions (Martens et al.,  
91 2015).

92 Although the lower limb extremity contributes less to propulsion and swim velocity in front  
93 crawl than the upper limb extremity (Amaro et al., 2017; Bartolomeu, Costa & Barbosa, 2018),

94 the quadriceps and hamstring muscle groups mobilise the hip and knee joints to generate  
95 drag and lift forces in coordination with the arm stroke (Bartolomeu et al., 2018; Martens et  
96 al., 2015; Morouco, Marinho, Izquierdo, Neiva & Marques, 2015). Strength impairments in  
97 the lower limb extremity might have increased importance in the lower sport classes where  
98 drag is more important in discriminating between performances (Oh, Burkett, Osborough,  
99 Formosa & Payton, 2013), due to the role that the leg kick plays in stabilising the body and  
100 generating lift forces that allow swimmers to maintain streamlined body positions (Amaro et  
101 al., 2017; Bartolomeu et al., 2018; Psycharakis & Sanders, 2010). Lower body muscular  
102 strength and power are also key determinants of starts and turns performance with the  
103 gluteus maximus and triceps surae contributing to joint torque during hip extension and  
104 plantar flexion, respectively, to generate propulsive actions during certain components of a  
105 swim race (Jones, Pyne, Haff & Newton, 2018; Morouco, Marinho, Amaro, Perez-Turpin &  
106 Marques, 2012).

107 This study presents isometric strength tests that have been designed to infer loss of muscular  
108 strength in the upper and lower limb extremities for evidence-based Para swimming  
109 classification. The aims were to: (i) examine the predictive validity of isometric strength tests  
110 to discriminate between non-disabled participants and Para swimmers with physical  
111 impairments, (ii) establish the strength of association between isometric strength tests and  
112 freestyle swim performance in Para swimmers with strength impairments, and (iii) establish  
113 the test-retest reliability of isometric strength tests in non-disabled participants. Isometric  
114 strength tests might have utility in Para swimming classification if they discriminate Para  
115 swimmers with strength impairment from non-disabled participants, have meaningful  
116 associations with swimming performance in Para swimmers, and are found to be reliable.

117

## 118 **METHODS**

## 119 **Participants**

120 Data were collected from 72 participants including Para swimmers and non-disabled  
121 participants (Table 1). Para swimmers had an eligible physical impairment resulting in loss of  
122 muscle power. They had received national or international classification, were undertaking  
123 planned training regimes and competing at a national or international level. Non-disabled  
124 participants were recruited from University of the Sunshine Coast, Australia or Manchester  
125 Metropolitan University, United Kingdom. They were between the ages of 18 and 35 years  
126 of age, apparently healthy and recreationally active (undertaking planned exercise, training  
127 or sport at least twice a week for a minimum total of 80 minutes). These eligibility criteria  
128 were established to recruit a convenient sample of non-disabled participants with a wide  
129 range of activity backgrounds. Such a cohort was considered advantageous when examining  
130 the predictive validity of strength tests to identify participants with and without physical  
131 impairment. All participants gave their written informed consent to participate in this study  
132 under approved ethical guidelines (A/16/892).

## 133 **Design**

134 Isometric strength tests were developed by the research team consisting of experts in  
135 evidence-based classification and Para swimming sport science. Tests were designed to  
136 explain activity limitation in the freestyle discipline. They went through a development  
137 process that included consultation with a panel of coaches, Para swimmers, classifiers,  
138 administrators and sport science and medicine personnel, and were piloted in individuals  
139 with disabilities. Para swimmers completed the test battery during organised data collection  
140 events within Europe and Australia. They completed physical impairment and swimming-  
141 specific assessments around their training schedules during these events. Non-disabled  
142 participants and Para swimmers attended at least one 90-minute session where they  
143 undertook the finalised test battery comprising four strength tests. Para swimmers also



144 attended a separate 30-minute session where their maximal freestyle swim performance  
145 was assessed. Non-disabled participants were asked to maintain their usual exercise or  
146 training regimes throughout their involvement in the study. Fifteen non-disabled  
147 participants repeated the test battery within a week to examine the test-retest reliability of  
148 strength tests.

#### 149 **Experimental procedures**

150 Participants completed a questionnaire regarding demographics, their typical training  
151 regime (type and frequency of training), and training activity on the day of testing. Para  
152 swimmers also provided information pertaining to their training experience, competition  
153 standard attained, current sport class, and type of physical impairment. These data were  
154 verified against information attained from classification records listed in the IPC Sports Data  
155 Management System (<https://db.ipc-services.org/sdms>). Participants' stature and body  
156 mass were recorded prior to the strength tests. Stature was estimated from sitting height  
157 recorded from a custom-built chair for Para swimmers with no or poor locomotor ability.  
158 Ratios of sitting height to standing height available in the World Para swimming Classification  
159 Manual were used for estimations (International Paralympic Committee, 2017).

160 The order of the strength tests was randomised. All participants undertook the test battery  
161 under the instruction and supervision of the principal researcher. Isometric strength was  
162 assessed using an S-type strain gauge attached to a custom-made aluminium frame that  
163 provided force-time data collected at 200 Hz (Ergotest, Porsgrunn, Norway). The strength  
164 test battery consisted of 4 tests that yielded 8 outcome measures: dominant and non-  
165 dominant (i) shoulder extension strength, (ii) shoulder flexion strength, (iii) hip extension  
166 strength and (iv) hip flexion strength. The strength test protocols are outlined in detail in  
167 Supplementary Table 1. Following practice trials, participants performed 3 maximal effort  
168 trials for each test. Once in position, participants were instructed to slowly build up their

169 applied force until reaching their maximal effort within 2-3 seconds. All contractions lasted  
170 between 4 and 10 seconds and were performed on each minute, giving participants at least  
171 50 seconds rest between consecutive trials (Beckman, Newcombe, Vanlandewijck, Connick,  
172 & Tweedy, 2014). Each participant was given the same set of instructions before and during  
173 contractions. The best trial indicated by the highest maximal voluntary contraction (MVC)  
174 was used for analysis. For each strength test a symmetry index was calculated as a ratio of  
175 their non-dominant to dominant limb strength.

176 Para swimmers maximal clean swim speed was assessed over a 10 m calibrated test zone for  
177 their preferred freestyle swim stroke. Clean swim speed was determined using standard two-  
178 dimensional video analysis procedures. Output from a 50 Hz video camera (Sony HDR HC9,  
179 Sony Corporation, Japan) placed perpendicular to the swimmers' direction of travel was  
180 captured using commercial software (Dartfish TeamPro version 7.0, Dartfish UK).  
181 Participants were instructed to reach maximal swim speed prior to the start of the 10 m test  
182 zone and sustain maximal swim speed until 5 m past the end of the test zone. They  
183 performed two maximal effort trials separated by a minimum of 3 minutes' rest and the  
184 fastest time to cover the 10 m test zone was used to compute their maximal clean swim  
185 speed. The recorded maximal clean swim speeds were found to have strong relationships  
186 with personal best race times for 50 m freestyle ( $R^2 = 0.914$ ) and 100 m freestyle ( $R^2 = 0.892$ )  
187 in our participant cohort. Maximal clean swim speed was not assessed for three Para  
188 swimmers with hypertonia due to limited time with these participants.

## 189 **Statistical analyses**

190 Statistics were calculated using R version 3.4.0 (R Core Team, 2017). Shapiro-Wilks tests  
191 indicated non-uniform distribution of several test measures for Para swimmers with  
192 hypertonia or impaired muscle power. A Kruskal-Wallis rank test was used to determine  
193 significant effects between hypertonia, impaired muscle power and non-disabled participant

194 groups. Wilcoxon tests were used post hoc to determine the source of significant effects,  
195 with p-values adjusted for multiple comparisons using the Benjamini and Hochberg method.  
196 Cliff's Delta (d), a non-parametric measure of effect size, was calculated with 95% confidence  
197 intervals to indicate the magnitude of difference in strength test measures between Para  
198 swimmers and non-disabled participants (Rogmann, 2013). Sex-specific differences were  
199 calculated as there were significant differences found in isometric strength measures  
200 between non-disabled male and female participants.

201 Random forest algorithm was used to establish the predictive validity of strength tests to  
202 classify participants with and without strength impairment. Random forest is a non-linear  
203 machine learning technique that uses an ensemble learning method for classification and  
204 regression (Liaw & Wiener, 2002; Woods, Veale, Fransen, Robertson & Collier, 2018).  
205 Separate models were built to determine the prediction accuracies based on sex. The  
206 importance of predictor variables was determined using the mean decrease in accuracy,  
207 which indicates the decrease in prediction accuracy that occurs when a single variable is  
208 excluded during the out-of-bag error calculation (Liaw & Wiener, 2002; Woods et al., 2018).

209 Spearman correlation coefficients were calculated to assess the strength of association  
210 between the Para swimmers' strength test measures and maximal clean swim speeds.  
211 Correlations were calculated for the entire cohort of Para swimmers and independently for  
212 the hypertonia and impaired muscle power groups. Significance was set at an alpha value of  
213  $\leq 0.05$ . The strength of correlations was interpreted as negligible (0.0-0.2), low (0.21-0.40),  
214 moderate (0.41-0.60), high (0.61-0.80) and very high ( $>0.81$ ) (Mukaka, 2012).

215 For non-disabled participants, normality of distribution was confirmed using the Shapiro-  
216 Wilk test. Unpaired sample t-tests assuming equal variances were used to determine  
217 differences between male and female participant groups. Reliability assessments were  
218 calculated using Hopkins' reliability spreadsheet (Hopkins, 2015). Paired sample t-tests were

219 conducted to identify any systematic change in test measures between repeated trials. Intra-  
 220 class correlation coefficients (ICC) method 3,1, standard error of measurement (SEM) scores  
 221 expressed in the original units of measurement, and coefficient of variation (CV) scores were  
 222 calculated to provide an absolute assessment of reliability (Hopkins, 2000).

223

## 224 **RESULTS**

225 Differences in strength scores between Para swimmers and non-disabled participants are  
 226 shown in Figure 1. Para swimmers showed significantly lower strength scores for all tests,  
 227 except for shoulder flexion strength in female Para swimmers (Figure 1C and 1D) and  
 228 dominant hip flexion strength in male Para swimmers with hypertonia (Figure 1G). Para  
 229 swimmers showed larger differences in strength scores compared with non-disabled  
 230 participants for their non-dominant limbs (Figure 1). This was illustrated in differences  
 231 between non-disabled participants and Para swimmers for symmetry indexes calculated for  
 232 shoulder extension strength (mean  $\pm$  range =  $0.96 \pm 0.12$  versus  $0.82 \pm 0.51$ ;  $d = 0.81$ ,  $p < 0.01$ ),  
 233 shoulder flexion strength (mean  $\pm$  range =  $0.94 \pm 0.14$  versus  $0.84 \pm 0.55$ ;  $d = 0.52$ ,  $p < 0.01$ ),  
 234 hip extension strength (mean  $\pm$  range =  $0.94 \pm 0.16$  versus  $0.48 \pm 0.99$ ;  $d = 0.77$ ,  $p < 0.01$ ), and  
 235 hip flexion strength (mean  $\pm$  range =  $0.95 \pm 0.11$  versus  $0.49 \pm 0.97$ ;  $d = 0.89$ ,  $p < 0.01$ ).

236 Random forest that included all strength test measures as predictor variables successfully  
 237 classified 25/26 (96 %) male Para swimmers and 15/16 (94 %) female Para swimmers. The  
 238 mean decrease in accuracy scores were similar for the male and female participant groups,  
 239 with lower limb strength and symmetry measures typically being the most important  
 240 variables for prediction of participants with and without physical impairment (Figure 2).

241 Maximal clean swim speeds were  $1.14 \pm 0.34 \text{ m.s}^{-1}$  (range 0.21 to  $1.62 \text{ m.s}^{-1}$ ) for male Para  
 242 swimmers and  $1.03 \pm 0.29 \text{ m.s}^{-1}$  (range 0.55 to  $1.51 \text{ m.s}^{-1}$ ) for female Para swimmers. Para

243 swimmers with hypertonia ( $1.19 \pm 0.27 \text{ m.s}^{-1}$ ; range 0.55 to  $1.62 \text{ m.s}^{-1}$ ) had slightly faster clean  
 244 swim speeds than Para swimmers with Impaired muscle power ( $1.00 \pm 0.35 \text{ m.s}^{-1}$ ; range 0.21  
 245 to  $1.51 \text{ m.s}^{-1}$ ), although there was no significant difference found between groups ( $p = 0.12$ ).  
 246 All strength scores had significant low to moderate correlations ( $r=0.32$  to  $0.53$ ,  $p \leq 0.05$ ) with  
 247 maximal clean swim speed in the combined cohort of Para swimmers, except for non-  
 248 dominant shoulder flexion ( $r=0.15$ ,  $p=0.35$ ) (Figure 3).

249 There were fewer strength scores that had significant correlations with clean swim speeds  
 250 when hypertonia or impaired muscle power groups were analysed independently (Figure 3).  
 251 Dominant and non-dominant shoulder extension strength had the strongest correlations  
 252 with maximal clean swim speed for Para swimmers with hypertonia ( $r=0.46$  to  $0.66$ ,  $p \leq 0.04$ )  
 253 and impaired muscle power ( $r=0.47$  to  $0.51$ ,  $p \leq 0.04$ ). Para swimmers with hypertonia also  
 254 showed significant correlations between clean swim speed and strength scores for dominant  
 255 shoulder flexion ( $r=0.66$ ,  $p < 0.01$ ) and dominant hip flexion ( $r=0.44$ ,  $p=0.05$ ), while there were  
 256 no correlations found for other strength tests ( $r=0.27$  to  $0.38$ ,  $p=0.10$  to  $0.25$ ). Para  
 257 swimmers with impaired muscle power reported no significant correlations between clean  
 258 swim speed and strength scores for shoulder flexion ( $r=-0.12$  to  $0.12$ ,  $p = 0.61$  to  $0.63$ ), hip  
 259 extension ( $r=0.12$  to  $0.31$ ,  $p=0.20$  to  $0.30$ ), or hip flexion ( $r=0.12$  to  $0.19$ ,  $p=0.45$  to  $0.61$ ).

260 Reliability assessments indicated all strength tests to be reliable in non-disabled participants  
 261 (Table 2). There were no significant changes in outcome measures between repeated trials,  
 262 with participants' absolute and relative changes ranging from  $-7 \pm 4 \text{ N}$  to  $2 \pm 18 \text{ N}$  and  $-5 \pm$   
 263  $10 \%$  to  $3 \pm 12 \%$ , respectively. Strength test measures in non-disabled participants are  
 264 shown in Figure 1 and Supplementary Table 2. Unpaired sample t-tests assuming equal  
 265 variances indicated significant differences ( $p < 0.01$ ) between non-disabled male and female  
 266 participants for all strength tests, except for measures of strength symmetry.

267

## 268    **DISCUSSION**

269    This study aimed to establish the validity and reliability of isometric strength tests for  
270    classification of Para swimmers with physical impairment. A key measurement property of  
271    these tests is their ability to identify Para swimmers with an eligible strength impairment.  
272    Eligibility is determined by type of physical impairment, as well as impairment severity that  
273    must conform to the minimum eligibility criteria. The isometric strength tests presented in  
274    this study were found to differ between Para swimmers with physical impairments and non-  
275    disabled participants (Figure 1), suggesting they will be useful in inferring loss of strength and  
276    guiding minimum eligibility criteria in Para swimming cohorts.

277    The strength test measures reported for non-disabled participants provide a useful  
278    benchmark to infer loss of muscle strength in Para swimmers, although there are several  
279    points to consider beforehand. First, there were significant differences in strength scores  
280    between non-disabled male and female participants suggesting that sex-specific benchmarks  
281    should be used to infer loss of strength in Para swimmers with physical impairment  
282    (Supplementary Table 2). Second, the non-disabled participants showed considerable  
283    variations in strength scores (Figure 1), likely due to the range in reported activity  
284    backgrounds (Table 1). Given that muscular strength is responsive to training type, volume  
285    and intensity (Crowley et al., 2017) it is important that normative values are collected in a  
286    larger sample of able-bodied swimmers with various training ages and regimes. This will  
287    provide classifiers with normative values in non-disabled participants stratified by age, sex  
288    and training status so that they can accurately infer Para swimmers' strength impairments.

289    Supporting the predictive validity of the isometric strength test battery, the random forest  
290    algorithm had a 95 % success rate in correctly classifying participants with and without  
291    physical impairment based on strength test measures. There were two Para swimmers that  
292    were incorrectly classified as non-disabled participants. The first was a male Para swimmer

293 with hemiplegic cerebral palsy that competes in the S6 class based on classification of motor  
294 coordination impairment, and so it is possible that that this participant is not affected by  
295 strength impairment. For Para swimmers with hypertonia, the current classification system  
296 assigns class based on the assessment of strength, motor coordination or range of movement  
297 depending on which one of these is judged to be most affected by the Para swimmer's health  
298 condition (International Paralympic Committee, 2017). It is interesting that all Para  
299 swimmers with hypertonia in this study compete in their current sport class based on  
300 assessment of motor coordination impairment. The high success rate of the random forest  
301 in classifying these Para swimmers using isometric strength and symmetry scores indicates  
302 that these Para swimmers have strength impairments that affect their swimming  
303 performance (Figure 3). This finding highlights the complexity of these Para swimmers'  
304 health conditions, and that classification should collectively account for impairments in  
305 strength, motor coordination and range of motion for these swimmers.

306 The incorrect classification of the female Para swimmer by the random forest algorithm  
307 raises several questions of the isometric strength test battery. This Para swimmer has an  
308 incomplete L4-L5 spinal cord injury and competes in the S8 sport class at Paralympic and  
309 World Championship standard. The random forest algorithm assigned 40 % of the votes to  
310 the priori case most likely as the participant's strength scores were within or higher than the  
311 lower and upper quartiles for scores in non-disabled females, except for dominant and non-  
312 dominant hip extension. This highlights the requirement of obtaining normative values in  
313 highly trained able-bodied swimmers to accurately infer strength impairment. Further, based  
314 on their classification records the Para swimmer was most affected by limited strength  
315 around the ankle joint. Active ankle range of motion is important to effectively orientate the  
316 foot segment during leg kicking to generate drag and lift forces (Connaboy et al., 2016), and  
317 plantar flexion at the ankle joint contributes to propulsion during starts and turns (Jones et  
318 al., 2018; Morouco et al., 2012). Although active range of motion assessments might explain

319 part of this swimmer's activity limitation (Nicholson et al., 2018), these results indicate that  
320 the isometric strength test battery is not entirely comprehensive.

321 An important aspect of this study was examining the convergent validity of isometric  
322 strength tests by establishing their strength of association with freestyle swim performance.

323 When the entire para swimming cohort was included in analyses there were low to moderate  
324 correlations found between maximal swim speed and all isometric strength scores, except

325 for non-dominant shoulder flexion (Figure 3). Para swimmers showed the strongest  
326 correlations between isometric shoulder extension strength and maximal clean swim speed

327 (Figure 3A and 3B). The upper limb extremity contributes to most of the propulsive force  
328 during tethered front crawl swimming (Amaro et al., 2017; Morouco et al., 2015), and the

329 shoulder position during this test represented the start of the underwater push phase where  
330 able-bodied swimmers achieve the highest absolute hand speeds (Samson, Monnet, Bernard,

331 Lacouture & David, 2015). The lower limb extremity contributes less to propulsion in front  
332 crawl swimming (Amaro et al., 2017; Morouco et al., 2015), which explains the lower

333 correlations found between hip flexion and extension strength and freestyle swim  
334 performance in the combined cohort of Para swimmers (Figure 3). The leg kick is important

335 in stabilising and controlling body roll in coordination with the arm stroke (Bartolomeu et al.,  
336 2018; Psycharakis & Sanders, 2010) and generates drag and lift forces that are likely to have

337 higher contributions to instantaneous swim velocity in cases where the arm stroke is limited  
338 by impairment (Morouco et al., 2015; Bartolomeu et al., 2018). However, these tests might

339 not comprehensively describe knee flexion and plantar flexion strength impairments that  
340 relate to starts and turns performance (Dingley et al., 2015; Jones et al., 2018) or propulsive

341 forces during swim kicking (Connaboy et al., 2016).

342 Ensuring that the isometric strength test battery is comprehensive and parsimonious is  
343 important to consider before its implementation into a revised classification system. It is



important to highlight that there were fewer correlations found between strength scores and maximal swim speeds when hypertonia and impaired muscle power groups were analysed independently (Figure 3). There are two explanations for these results. First, the wide range in location and distribution of strength impairment of Para swimmers that are within these groups affect the ability of any singular strength score to explain activity limitation in swimming. For instance, Para swimmers with impaired muscle power had a range of medical conditions (Table 1), some that might cause an even distribution of strength impairment across the upper and lower limbs (e.g. Charcot-Marie-Tooth disease) and others where strength impairment is confined to the trunk and lower limbs (e.g. complete SCI). Despite no correlation being found between lower limb strength and swim performance within this group (Figure 3), lower limb strength scores might be useful in explaining activity limitation in Para swimmers that have some remaining lower limb muscle power due to the role of leg kick in controlling body roll and stabilising the torso (Bartolomeu et al., 2018; Psycharakis & Sanders, 2010). Conversely, the assessment of trunk impairment might be more important in understanding activity limitation in Para swimmers with complete SCI that cannot leg kick due to having no lower limb muscle power (Altman et al., 2017; Altman et al., 2018; Psycharakis & Sanders, 2010).

Another explanation for the above, is that the type of physical impairment influences the association between strength tests and para swimming performance. It is interesting to note that Para swimmers with hypertonia showed a high correlation between dominant shoulder flexion and maximal clean swim speed ( $r=0.66$ ,  $p<0.01$ ), while there was no correlation found in Para swimmers with impaired muscle power (Figure 3C). This test was included in the battery as it was thought it would describe activity limitation in Para swimmers with severe impairments that use modified swim strokes (Prins & Murata, 2008). The positioning and action of the isometric shoulder flexion test is dissimilar to the kinematics of the underwater and recovery stroke phases of front crawl in able-bodied swimmers (Martens et al., 2015),

370 which explains why no correlation was found with maximal swim speed in the impaired  
371 muscle power group. Conversely, the shoulder flexion strength test might be associated with  
372 the level of spasticity that affects Para swimmers with hypertonia and may be collinear with  
373 reduced motor coordination and range of motion that affects swim performance. Indeed,  
374 spasticity typically affects the flexor, adductor and internal rotator muscle groups more than  
375 their antagonists (Antunes, Rossato, Lima Kons, Luiz Sakugawa & Fischer, 2017; Delgado &  
376 Albright, 2003), and there is a high inverse association between the level of spasticity and  
377 voluntary motor function in people with health conditions such cerebral palsy and acquired  
378 brain injury (Delgado & Albright, 2003). These results highlight the impairment-specific  
379 nature of activity limitation in Para swimming, and that separate test batteries could be used  
380 to classify Para swimmers based on their aetiology of impairment.

381 The final aim of this study was to establish the test-retest reliability of strength tests. All tests  
382 were shown to be reliable in non-disabled participants, which is a prerequisite for evidence-  
383 based classification. Unfortunately, reliability in Para swimmers with hypertonia or impaired  
384 muscle power was not assessed due to limited time available to test these swimmers.  
385 Reliability data was collected in a convenient sample of non-disabled participants as  
386 measures that were found to be unreliable in this cohort would be unlikely to have  
387 acceptable reliability in Para swimmers with physical impairments (Beckman et al., 2014;  
388 Connick, Beckman, Deuble & Tweedy, 2016; Nicholson et al., 2018). Future studies should  
389 now establish the reliability of measures in Para swimmers with physical impairments to  
390 confirm their utility in Para swimming classification.

391 It is important to note that the application of this study's findings is limited without further  
392 research. This study intentionally limited tests that were designed to explain activity  
393 limitation in the freestyle discipline as there was limited time available to test Para swimmers.  
394 While there is likely to be some crossover between tests, other swim strokes are dependent

395 on muscle groups and actions that were not assessed in this study (Martens et al., 2015).  
396 Targeted efforts are now required to develop strength tests that explain activity limitation in  
397 other swim strokes. Once this has been achieved, data collection in a larger sample of para  
398 swimmers can be conducted to define the relative impact that strength impairments have  
399 on swimming performance and guide valid classification structures (Altman et al., 2018;  
400 Connick et al., 2018; Hogarth, Payton, Van de Vliet, Connick & Burkett, 2018).

401 The isometric strength tests in this study also have several inherent limitations in classifying  
402 strength impairment. Namely, they are susceptible to athletes misrepresenting their abilities,  
403 they limit strength assessment to a fixed range of motion, strength scores might be  
404 susceptible to fatigue induced by prior activity or the tests themselves, and measures might  
405 be responsive to sport-specific training regimes (McGuigan, Newton, Winchester & Nelson,  
406 2010). Even with these limitations, the objective measurement of strength impairment will  
407 undoubtedly improve the accuracy and transparency of Para swimming classification  
408 compared with current methods (Connick et al., 2018). Additionally, longitudinal  
409 assessments of isometric strength in Para swimmers will provide insights into their  
410 responsiveness to sport-specific training regimes so that classifiers can more accurately infer  
411 strength impairment, and machine learning algorithms can predict competitive  
412 performances from objective impairment measures to identify outlying performances  
413 caused by intentional misrepresentation of abilities (Hogarth et al., 2018).

414

## 415 **CONCLUSIONS**

416 This study presented isometric strength tests that were developed to permit evidence-based  
417 classification in Para swimming. Strength test measures had acceptable reliability in non-  
418 disabled participants - a requisite of evidence-based classification. Differences in strength  
419 test measures were found between non-disabled participants and Para swimmers with

420 hypertonia or impaired muscle power, and random forest algorithm successfully classified  
421 95% of Para swimmers. These results indicate that these tests will be useful in inferring loss  
422 of strength in Para swimmers with strength impairment and guiding minimum eligibility  
423 criteria. Dominant and non-dominant strength scores also had significant correlations with  
424 maximal freestyle swim speed in Para swimmers. This suggests that strength tests will be  
425 useful in explaining activity limitation in Para swimming, although results indicate that the  
426 type and aetiology of physical impairment influence the utility of some strength tests.  
427 Collectively, the results of this study make a significant contribution toward evidence-based  
428 methods of classification for Para swimmers with strength impairments.

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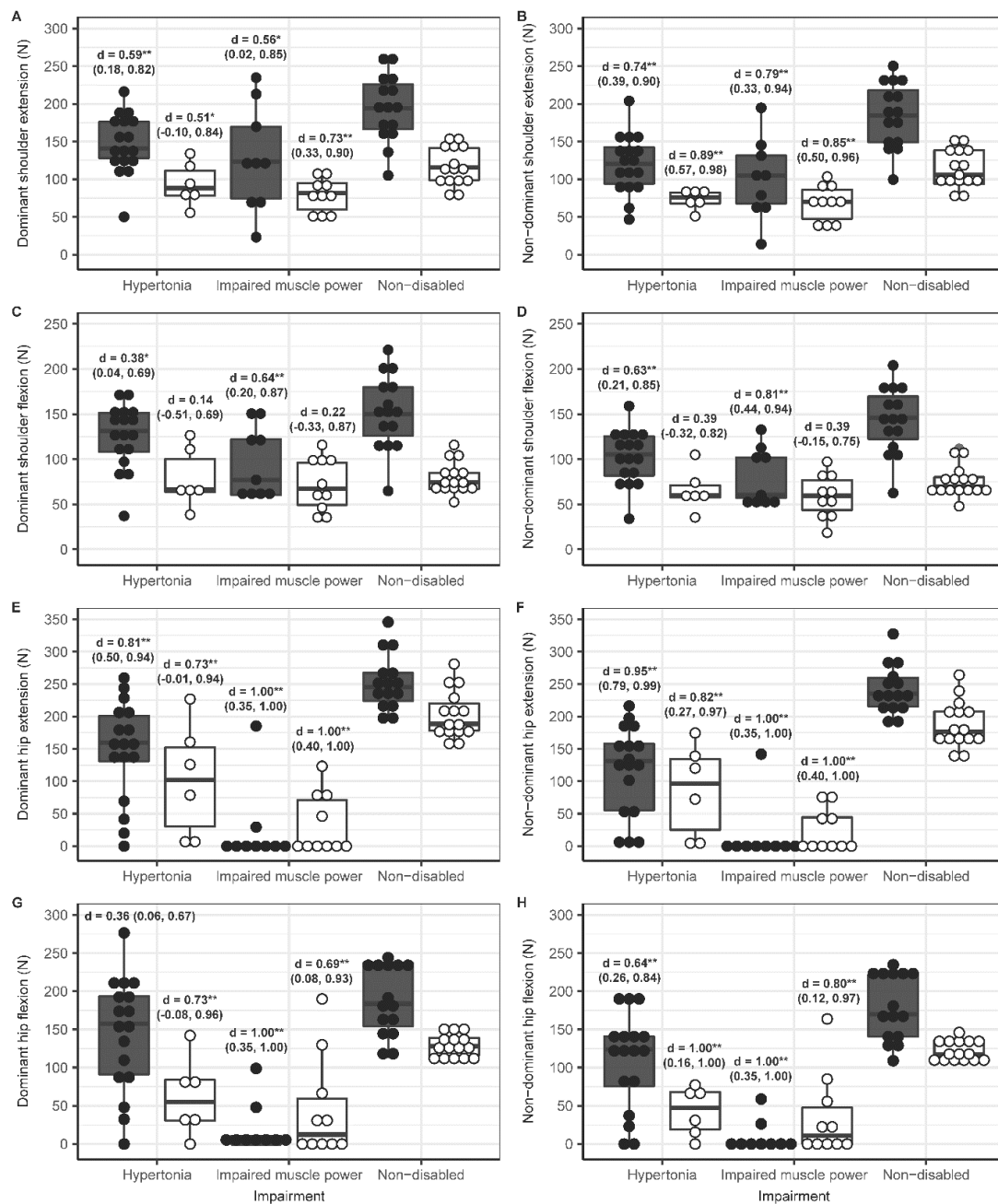
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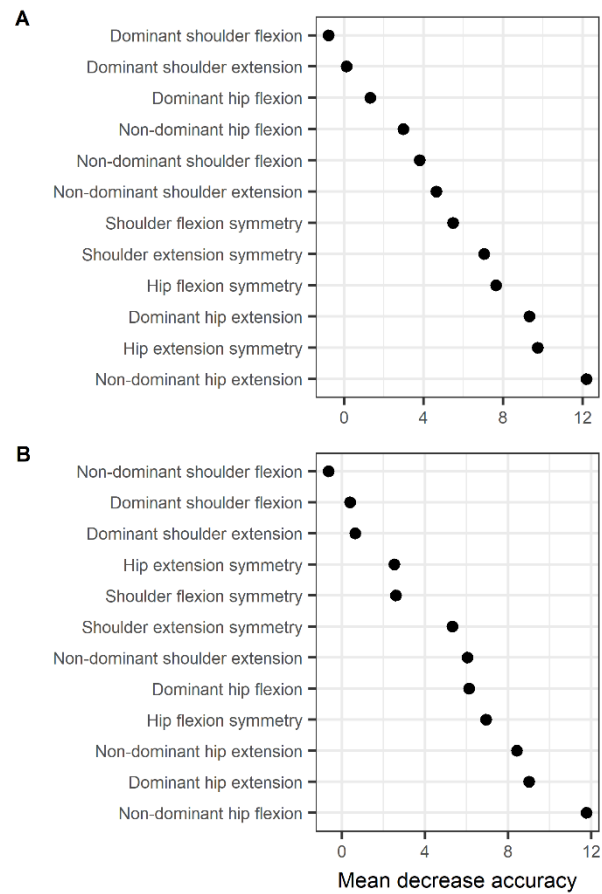
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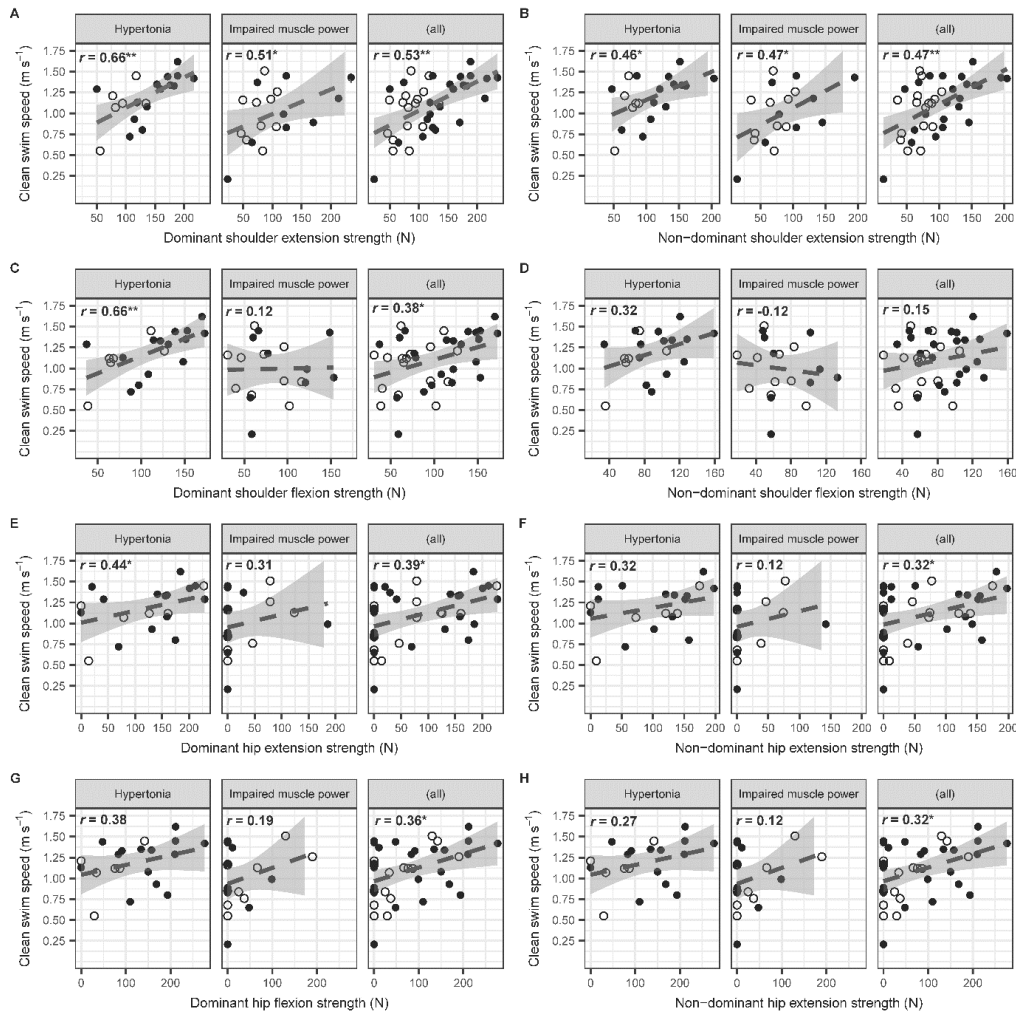
## Figure captions



**Figure 1. Strength test scores for Para swimmers with physical impairments and non-disabled participants.** Scores a for (A) dominant and (B) non-dominant shoulder extension, (C) dominant and (D) non-dominant shoulder flexion, (E) dominant and (F) non-dominant hip extension, and (G) dominant and (H) non-dominant hip flexion. Data are reported for male (dark colour box plots) and female (white colour box plots) participants. Data are Cliff's delta scores with 95% CI indicating differences between para swimmers and non-disabled participants. \*( $p \leq 0.05$ ) and \*\*( $p \leq 0.01$ ) indicate significance.



**Figure 2. Mean decrease in accuracy scores indicating variable importance in classifying participants with and without physical impairment.** Scores are reported for (A) male and (B) female participants. The variable importance score is the decrease in accuracy for each predictor variable when it is excluded from the classification model. The plot shows “non-dominant hip flexion” strength to be the strongest predictor in whether male and female participants did or did not have physical impairment.



**Figure 3. Strength of association between strength test scores and clean swim speed during maximal freestyle swimming.** Data are Spearman correlation coefficients indicating strength of association between clean swim speed and (A) dominant and (B) non-dominant shoulder extension, (C) dominant and (D) non-dominant shoulder flexion, (E) dominant and (F) non-dominant hip extension, and (G) dominant and (H) non-dominant hip flexion. Plots show these associations for the combined cohort of para swimmers ( $n=39$ ) and independently for Para swimmers with hypertonia ( $n=20$ ) or impaired muscle power ( $n=19$ ). Male (dark colour dots) and female (white colour dots) participants were pooled for analysis. \* ( $p \leq 0.05$ ) and \*\* ( $p \leq 0.01$ ) indicate significance.

Table 1. Characteristics of non-disabled participants and para swimmers with physical impairment.

		Hypertonia	Impaired muscle power	Non-disabled
	Males	n = 17	n = 9	n = 15
	Females	n = 6	n = 10	n = 15
Age (yrs)	Males	26.5 (7.0)	31.5 (7.7)	24 (4)
	Females	19.8 (4.1)	29.9 (10.2)	23 (5)
Body mass (kg)	Males	67.9 (9.8)	63.4 (14.4)	79.8 (11.4)
	Females	58.2 (10.30)	56.2 (10.3)	68.1 (9.7)
Stature (cm)	Males	172.0 (8.8)	167.2 (12.4)	182.7 (7.7)
	Females	160.7 (9.0)	153.0 (13.4)	171.4 (7.0)
Reported exercise frequency (n/week)		Median = 7.5 Range = 2 to 15	Median = 7 Range = 3 to 14	Median = 6 Range = 3 to 14
Accumulated exercise duration (min/week)		Median = 720 Range = 180 to 1200	Median = 630 Range = 180 to 1170	Median = 360 Range = 150 to 1200
Reported activities		Competitive swimming (n=23) Resistance training (n=15)	Competitive swimming (n=19) Resistance training (n=6) Wheelchair rugby (n=1) Pilates and Yoga (n=1)	Resistance training (n=17) Recreational fitness <sup>a</sup> (n=13) Competitive sport <sup>b</sup> (n=12) Recreational sport <sup>c</sup> (n=8) Pilates and Yoga (n=4)
Competitive standard		International <sup>d</sup> (n=9) National (n=14)	International <sup>d</sup> (n=9) National (n=10)	
Competitive swim experience (yrs)		Median = 9.5 Range = 2 to 26	Median = 7 Range = 4 to 20	
S Class		S3 (n=1) S4 (n=4) S5 (n=2) S6 (n=5) S7 (n=2) S8 (n=7) S9 (n=2)	S1 (n=2) S3 (n=2) S4 (n=2) S5 (n=3) S6 (n=3) S7 (n=2) S8 (n=3) S9 (n=2)	
Medical conditions		Diplegic CP (n=8) Hemiplegic CP (n=9) Quadriplegic CP (n=4) Other (n=2)	Incomplete SCI (n=4) Complete SCI (n=8) Charcot-Marie-Tooth disease (n=2) Spina bifida (2) Polio (n=1) Other (n=3)	

CP = cerebral palsy, SCI = spinal cord injury. S Class = para swimmers' current class for freestyle, backstroke and butterfly swimming events. <sup>a</sup> Reported recreational fitness activities included moderate to high-intensity aerobic exercise, and group fitness classes. <sup>b</sup> Reported competitive sports training or competition included athletics, rugby, AFL, football, powerlifting and swimming. <sup>c</sup> Reported recreational sport competition included football, badminton, netball, jujitsu, dance and surfing. <sup>d</sup> Para swimmers were classified as international standard if they had competed during a Paralympic or World Championship event.


Table 2. Reliability of strength test measures in non-disabled participants.

		Trial 1 Mean (SD) (N)	Trial 2 Mean (SD) (N)	$\Delta$ T2 – T1 Mean (SD) (N)	SEM (N)	CV (%)	ICC (95% CI)
Shoulder extension strength	Dominant	170.3 (54.0)	172.0 (52.1)	1.7 (15.1)	10.2	6.9	0.97 (0.92-0.99)
	Non-dominant	156.0 (50.4)	157.8 (44.3)	1.9 (18.3)	12.9	8.5	0.94 (0.87-0.98)
Shoulder flexion strength	Dominant	128.1 (39.3)	122.3 (35.6)	-5.9 (12.1)	8.6	6.8	0.97 (0.91-0.99)
	Non-dominant	117.1 (37.0)	110.4 (33.4)	-6.7 (14.1)	10.0	7.7	0.96 (0.9-0.98)
Hip extension strength	Dominant	245.1 (46.9)	242.7 (46.1)	-2.5 (20.3)	14.4	6.4	0.91 (0.78-0.96)
	Non-dominant	225.3 (38.3)	222.7 (45.4)	-2.6 (24.5)	17.4	8.0	0.85 (0.65-0.94)
Hip flexion strength	Dominant	168.8 (46.7)	164.7 (42.7)	-4.2 (19.7)	14.0	9.1	0.91 (0.78-0.96)
	Non-dominant	157.2 (43.5)	155.5 (45.7)	-1.7 (15.2)	10.7	6.8	0.95 (0.89-0.98)

SEM = standard error of measurement, CV = coefficient of variation, ICC = intraclass correlation coefficient, CI = confidence interval.

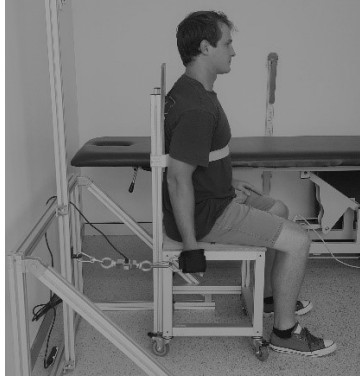
## Supplementary online material

Supplementary Table 1. Description of isometric strength tests developed for Para swimming classification.


Test description	
<p><b>Strength test:</b> Shoulder extension</p> <p><b>Procedure:</b> Participants sat with their trunk firmly supported by a back-rest and strapping. The cuff attached to the load cell was positioned at shoulder height in front of the arm being tested. The palm of the participants hand was placed downwards in the cuff with their elbow in a neutral position, and 90° of shoulder flexion. Positioning was confirmed using a digital inclinometer. The load cell was zeroed before trials with participants in the test position. Participants were instructed to apply maximum force to the load cell attachment while keeping their knuckles of the tested hand in contact with the upright of the strength rig.</p> <p><b>Rationale:</b> The shoulder position in this test represents the mid-stroke position or the start of the underwater push phase. The upper limb extremity contributes to most of the propulsion during front crawl with the underwater push phase being an important due to the maximum hand speeds that are produced by able-bodied swimmers during this phase. This test also requires the participant to stabilise the elbow and wrist joint during muscular contractions, which is similar to joint actions during the underwater push and pull phases during front crawl.</p> <p><b>Limitations in people with disabilities:</b> All para swimmers participating in this study could attain the shoulder position for this test. One para swimmer with spastic cerebral palsy could not perform a maximal effort without co-contraction of the elbow flexors, suggesting splinting or bracing methods might improve the validity and reliability of this test in people with disabilities.</p>	




Supplementary Table 1 (continued). Description of isometric strength tests developed for Para swimming classification.

Test description	
<p><b>Strength test:</b> Shoulder flexion</p> <p><b>Procedure:</b> Participants sat with their trunk firmly supported by a back-rest and strapping. The hand of the tested arm was placed in the cuff with the palm facing forward in a neutral position, elbow in a neutral position, and shoulder in a neutral. The load cell was attached to the strength rig at the height of the tested hand with the attachment taut when participants were in the test position. The load cell was zeroed before trials with participants shoulder in an extended position so that the load cell attachment was not taut. Participants were instructed to “take the slack” of the load cell attachment and pause prior to commencing the maximal effort test.</p> <p><b>Rationale:</b> Although being dissimilar to front crawl kinematics in able-bodied swimmers, this test was included in the battery to explain activity limitation in para swimmers with severe physical impairments. Some of these para swimmers will use modified stroke patterns in the freestyle discipline, such as double armed backstroke. The shoulder positioning during this test might represent part of the underwater propulsion phase for these swimmers.</p> <p><b>Limitations in people with disabilities:</b> While all para swimmers could attain the shoulder positioning for this test, one para swimmer with spastic cerebral palsy could not perform the shoulder action without co-contraction of the elbow flexors, suggesting splinting or bracing methods might improve the validity and reliability of this test in people with disabilities.</p>	

Supplementary Table 1 (continued). Description of isometric strength tests developed for Para swimming classification.

Test description	
<p><b>Strength test:</b> Hip extension</p> <p><b>Procedure:</b> Participants were in a supine position on a massage plinth with their legs off the bench at the popliteal crease. The tested leg was placed in an ankle cuff that attached the load cell to the strength rig so that the tested leg was in 15° of hip flexion, and neutral knee and ankle positioning. Arms were folded across the chest, and the foot of the tested leg was not in contact with the strength rig. Positioning was confirmed using a digital inclinometer that was placed on the mid-section of the thigh. The load cell was zeroed before trials with participants in the test position.</p> <p><b>Rationale:</b> The leg kick contributes to propulsion and plays an important role in stabilising the body in coordination with the arm stroke during front crawl swimming. This test was designed to explain the contribution of the posterior chain in allowing para swimmers to maintain streamlined body positioning during freestyle. Hip extension strength is also important to starts and turns performance.</p> <p><b>Limitations in people with disabilities:</b> Several para swimmers with contractures around the hip and knee could not achieve standardised positioning for this test. Para swimmers with diplegic cerebral palsy often could not achieve full knee extension. One para swimmer with severe hip and knee contractures had to perform the test in a modified seated position with the ankle strap attached as the lower thigh.</p>	

Supplementary Table 1 (continued). Description of isometric strength tests developed for Para swimming classification.

Test description	
<p><b>Strength test:</b> Hip flexion</p> <p><b>Procedure:</b> Participants were in a supine position on a massage plinth with their legs off the bench at the popliteal crease. The tested leg was placed in an ankle cuff. The load cell attachment was positioned so that it was taut when the hip and knee of the tested leg were horizontal. Arms were folded across the chest, and the foot of the tested leg was not in contact with the strength rig. The load cell was zeroed before trials with participants leg in a relaxed position so that the load cell attachment was not taut. Participants were instructed to “take the slack” of the load cell attachment and pause prior to commencing the maximal effort test.</p> <p><b>Rationale:</b> The leg kick contributes to propulsion and plays an important role in stabilising the body in coordination with the arm stroke during front crawl swimming. This test was designed to explain the contribution of kip and knee flexion to the drag and lift forces generated by the leg kick during front crawl.</p> <p><b>Limitations in people with disabilities:</b> Several para swimmers with contractures around the hip and knee could not achieve standardised positioning for this test. Para swimmers with diplegic cerebral palsy often could not achieve full knee extension. One para swimmer with severe hip and knee contractures had to perform the test in a modified seated position with the ankle strap attached as the lower thigh.</p>	

### Supplementary online material

Supplementary Table 2. Strength test measures (mean  $\pm$  SD) in non-disabled participants.

		Males (n=15)	Females (n=15)
Shoulder extension strength	Dominant (N)	194.3 (44.2)	117.0 (25.6)*
	Non-dominant (N)	184.7 (43.0)	113.4 (25.3)*
	Symmetry index	0.95 (0.03)	0.97 (0.02)
Shoulder flexion strength	Dominant (N)	152.3 (40.8)	79.2 (17.6)*
	Non-dominant (N)	142.9 (36.5)	74.0 (16.6)*
	Symmetry index	0.94 (0.03)	0.94 (0.05)
Hip extension strength	Dominant (N)	252.8 (42.8)	192.7 (34.6)*
	Non-dominant (N)	240.8 (37.3)	187.1 (36.0)*
	Symmetry index	0.95 (0.02)	0.92 (0.05)
Hip flexion strength	Dominant (N)	188.6 (46.2)	128.8 (14.9)*
	Non-dominant (N)	178.7 (43.1)	122.3 (14.0)*
	Symmetry index	0.95 (0.04)	0.95 (0.04)

\* indicates significant difference ( $p < 0.01$ ) to male group.