

1 Title: The associations between digit ratio (2D:4D and right - left 2D:4D), maximal oxygen  
2 consumption and ventilatory thresholds in professional male football players

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29 Abstract

30 Introduction: Digit ratio (2D:4D: the relative length of the 2<sup>nd</sup> and 4<sup>th</sup> digit) is thought to be a  
31 negative correlate of prenatal testosterone. The 2D:4D is related to oxygen metabolism but  
32 the precise nature of this relationship is unclear. The purpose of the present study was to  
33 consider associations between digit ratios (right 2D:4D, left 2D:4D, right-left 2D:4D [Dr-l])  
34 and VO<sub>2max</sub> and ventilatory thresholds (VT1 and VT2). Methods: One hundred and thirty-  
35 three Caucasian (n=133) professional football players competing in Cyprus participated in the  
36 study. Players underwent anthropometric measurements and digit lengths were measured  
37 from hand scans. They also completed an incremental cardiopulmonary test to exhaustion on  
38 a treadmill. Results: There were negative correlations between digit ratios and VO<sub>2max</sub> (right  
39 2D:4D,  $r = -.65$ ; left 2D:4D  $r = -.37$ , both  $p < .0001$ ; Dr-l  $r = -.30$ ,  $p = .0005$ ). There were no  
40 relationships between digit ratios and VT1. For VT2 there were negative relationships with  
41 digit ratios (right 2D:4D,  $r = -.43$ ,  $p < .0001$ ; left 2D:4D,  $r = -.21$  and Dr-l,  $r = -.21$ , both  $p =$   
42  $.02$ ). Digit ratios are negatively related to VO<sub>2max</sub> with large (right 2D:4D) and medium (left  
43 2D:4D, Dr-l) effect sizes. For VT2, there were also negative correlations, which were  
44 medium (right 2D:4D) and small (left 2D:4D, Dr-l). Conclusion: Our findings may be helpful  
45 to clarify the relationships between digit ratios and high-intensity actions for extended  
46 periods which are dependent on efficient oxygen metabolism.

47 Key Words: Prenatal testosterone, Aerobic fitness, Digit ratios, Soccer

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## 55 **Introduction**

56 The relative lengths of the 2<sup>nd</sup> and 4<sup>th</sup> digits (2D:4D) and the side difference in 2D:4D (Dr-l:  
57 right-left 2D:4D) are thought to be negative correlates of 1<sup>st</sup>-trimester testosterone and  
58 positive correlates of 1<sup>st</sup>-trimester oestrogen (Manning et al., 1998; Manning et al., 2002;  
59 Breedlove, 2010; Swift-Gallant et al., 2020). The 2D:4D and Dr-l show sexual dimorphism  
60 (males<females), the sex difference appears in the 1<sup>st</sup> trimester and shows little change in  
61 children, juveniles and adults (Malas et al., 2006; Trivers et al., 2006; Manning et al., 2022).  
62 In contrast to the links between digit ratios and prenatal sex steroids, there is little evidence of  
63 associations between 2D:4D and background levels of testosterone or oestrogen in adults  
64 (Hönekopp et al., 2007).

65 Manning and Taylor (2001) were the first to report that 2D:4D was negatively associated  
66 with performance among male participants from a range of sports including >300 elite  
67 footballers competing in the English Leagues. In addition, meta-analyses have found negative  
68 relationships between 2D:4D and performance in a number of sports with mean right-hand  
69 effect sizes of  $r = -0.28$  (Hönekopp and Schuster, 2010) and weak negative relationships with  
70 hand grip strength (Pasanen et al., 2022). With regard to endurance disciplines, Manning et  
71 al., (2007) have reported strong correlations between 2D:4D and running speed in middle-  
72 and long-distance races ( $r^2$  values of approximately 25% for males and females). They  
73 suggested that 2D:4D may be a strong correlate of vascular health. However, reports of  
74 associations between 2D:4D,  $VO_{2max}$  and ventilatory threshold (VT) employing objective lab-  
75 based measures of  $VO_{2max}$  and VT have yielded mixed results from samples that were small  
76 and were recruited from a range of backgrounds in sports(Hill et al., 2012; Holzapfel et al.,  
77 2016; Lombardo et al., 2020). In this regard, it is important to examine the relationships  
78 between digit ratios (2D:4D and Dr-l) and oxygen metabolism in a larger sample of athletes  
79 who participate in the same sport. The latter includes,  $VO_{2max}$  (maximal oxygen consumption;

80 Hill and Lupton, 1923) and ventilator thresholds [(VT1 the point during exercise at which  
81 pulmonary ventilation and carbon dioxide output begin to increase exponentially; Cerezuela-  
82 Espejo et al., 2018), and VT2 or RC (the point associated with hyperventilation at which  
83 lactate is rapidly increasing with intensity; Meyer et al., 2004).

84 Evidence for links between digit ratios and oxygen metabolism may be indicated by the types  
85 of sport linked to 2D:4D or Dr-l. Low values of digit ratios have been reported to be  
86 associated with high performance in a range of sports. For males, these include football  
87 (soccer; Manning and Taylor, 2001), rugby (Bennett et al., 2010), skiing (Manning, 2002),  
88 rowing (Longman et al., 2011), surfing (Kilduff et al., 2011), wrestling (Keshavarz et al.,  
89 2017), basketball (Klapprodt et al., 2018) and for females, rowing (Hull et al., 2015), skiing  
90 (Manning 2002), and Olympic athletes participating in power, endurance and technical sports  
91 (Eklund et al., 2020). Therefore, low digit ratios may be linked to both strength and  
92 endurance. However, a consideration of associations between 2D:4D and running speed  
93 suggests that the latter shows greater effect sizes than the former. In this regard, Manning et  
94 al., (2007) and Longman et al., (2015) have reported correlations between 2D:4D and running  
95 speed in long-distance races ranging in strength from  $r = .40$  to  $r = .60$  in males and  $r = .20$  to  
96  $r = .30$  in females. In contrast, 2D:4D was indicated to be weakly related to sprinting speed  
97 with correlations averaging about  $r = .10$  (Hönekopp and Schuster, 2010; Manning and Hill,  
98 2009). Physiological variables ( $VO_{2max}$ , velocity at maximal oxygen uptake, and changes in  
99 lactate levels), training load and fat mass are considered the main factors determining  
100 performance in long-distance races (Alvero-Cruz et al, 2020). The strong relationship  
101 between 2D:4D and speed in long-distance races suggests that 2D:4D may be a negative  
102 correlate of maximal aerobic performance and in particular, it is likely to be predictive of  
103 maximal oxygen uptake ( $VO_{2max}$ ) and/or Ventilatory Thresholds (VT1 and VT2).

104 However, attempts to quantify relationships between digit ratio and  $VO_{2max}$  and VT1 and  
105 VT2 have met with mixed results. Hill et al., (2012) considered relationships between digit  
106 ratios and oxygen metabolism in 41 boys (mean age 13.9 [SD1.3] years). They found no  
107 significant relationships for right or left 2D:4D but there were negative correlations of  
108 medium strength for Dr-1 and  $VO_{2max}$ . In contrast, Holzapfel et al., (2016) reported no  
109 significant correlations between 2D:4D (Dr-1 was not considered) and  $VO_{2max}$  in a sample of  
110 26 men and 28 women but strong negative relationships were demonstrated for 2D:4D and  
111 VT. Furthermore, Lombardo and Otieno (2020) reported on digit ratio and aerobic fitness  
112 variables in 11 boys and 15 girls, aged between 11 and 19 years, who were the top five  
113 finishers in 10 or more races of 10 km. In their study, boys (but not girls) with lower right  
114 2D:4D had significantly greater  $VO_{2max}$ . Girls (but not boys) with lower right 2D:4D had  
115 significantly greater VT. Thus, it appears that digit ratios are related to maximal aerobic  
116 performance but the strength of the relationship and the relative importance of  $VO_{2max}$  and  
117 VT needs to be clarified. In general, sample sizes thus far were small, and participants varied  
118 in their participation in sports. Therefore, we consider relationships between digit ratios  
119 (2D:4D and Dr-1) and  $VO_{2max}$ , and VT1 and VT2 in a large sample of male professional  
120 football players.

## 121 **Materials and Methods**

### 122 *Participants*

123 An initial sample of 143 professional male football players (age:  $25.21 \pm 5.47$  years,  
124 height:  $180.15 \pm 6.12$ cm, weight:  $76.40 \pm 7.12$  kg) participating in Division 1 and 2 in the  
125 Eastern Mediterranean was recruited. The sample included 133 Caucasian and 10 Black  
126 participants. Due to significant differences in the anthropometric characteristics and digit  
127 ratios between the Caucasian and Black players, our statistical analyses were mainly focused  
128 on the Caucasian players (n=133).

129 Testing was undertaken during the months of June and July before the pre-season period.  
130 Exclusion criteria included injuries within the last 2 months before the testing. Anthropometric  
131 measurements (age, stature, body weight, body fat and hand scans) were recorded before the  
132 physical tests. Players' characteristics are given in Table 1. The players completed an  
133 incremental cardiopulmonary test to exhaustion on a treadmill. All players were familiar with  
134 the testing protocol as this was part of their annual testing. They were instructed to avoid heavy  
135 physical activity the day prior to the testing. All participants completed an informed consent  
136 after being briefed about the procedures and the technical director of the team approved all the  
137 testing protocols. The research has complied with the relevant national regulations, was  
138 conducted in accordance with the Declaration of Helsinki and has been approved by the  
139 National Committee of Bioethics (EEBK EP 2022.01.290).

## 140 **Procedure**

### 141 *Anthropometric measurements*

142 Anthropometric measurements were conducted using a wall stadiometer (Leicester; Tanita,  
143 Tokyo, Japan) to determine the players' stature and a leg-to-leg bioelectrical impedance  
144 analyser (BC418MA; Tanita) to assess body composition (% body fat). The players were  
145 instructed to follow the standard guidelines prior to the bioelectrical impedance testing (Kyle  
146 et al., 2004).

### 147 *Hand scans*

148 Players were asked to place their hand on the surface of the photocopier (EPSON scanner,  
149 DS-50000) with the palm facing downwards and fingers as straight as possible according to  
150 the methodology described by previous investigators (Manning, 2002). They were instructed  
151 not to exert too much pressure but lightly place their fingers on the photocopier and wait until  
152 the scan was completed. The scan was evaluated by a single examiner and in cases where it

153 was not clear it was repeated. The finger length was measured twice by the same investigator,  
154 blind to the oxygen data, and the 2D:4D ratio was calculated from each set of scans. Digit  
155 length was measured to an accuracy of 0.05 mm using Vernier callipers (Mitutoyo, D15,  
156 Japan).

### 157 *Incremental cardiopulmonary testing on a treadmill*

158 The players completed an incremental cardiopulmonary test to exhaustion (CPET) on a  
159 treadmill (HP Cosmos Quasar med, HP Cosmos Sports, and Medical GmbH, Nussdorf-  
160 Traunstein, Germany). Gas exchange measurements were collected with reusable masks, a  
161 turbine flow meter, and a two-way nonrebreathing valve (model 7940, Hans Rudolph, Kansas  
162 City, MO). Heart rate (COSMED wireless HR monitor, Rome, Italy), VO<sub>2</sub>, carbon dioxide  
163 (VCO<sub>2</sub>) production and expired minute volume (VE) were continuously monitored  
164 throughout the test and a breath-by-breath analysis was performed on a computerized  
165 (Cosmed Quark CPET, Rome, Italy) system. Before each test, the air VO<sub>2</sub> flowmeter and  
166 oxygen-carbon dioxide meters were calibrated with a three-litre air syringe and a gas of  
167 known oxygen (16.5%), based on the manufacturer's recommendations. Throughout the  
168 testing, laboratory conditions were kept constant, with the temperature being around 21-22  
169 degrees (C) and the relative humidity around 50%.

170 During the test, the inclination was kept constant at 1%. The players started the test at a speed  
171 of 8km/hr and the speed was increased every 3.15 minutes by 2km/hr until they reached  
172 volitional exhaustion or could no longer continue. ~~In addition, the test was terminated when~~  
173 ~~there was no variation in VO<sub>2max</sub> despite the increase in workload.~~ The recovery speed was 5  
174 km/h for 2-3 minutes. The VO<sub>2max</sub> was identified after filtering the results by indicating the  
175 highest value for an average of 10 seconds and was expressed relative to body mass  
176 (ml/kg/min). The ventilatory threshold (VT1) was identified through the V-slope method (the

177 point at which the increase in the rate of elimination of carbon dioxide is greater than the  
178 increase in  $\dot{V}O_2$ ) and was verified at the nadir of the  $\dot{V}E/\dot{V}O_2$  curve. The respiratory  
179 compensation point ( $V_{T2}$  or RC) was determined at the nadir of the  $\dot{V}E/\dot{V}CO_2$  curve (Beaver  
180 et al., 1986).

### 181 *Statistical Analysis*

182 Means and standard deviations (mean  $\pm$  SD) were calculated for all the parameters. The  
183 homogeneity of variance was tested using the Brown-Forsythe test and the normality  
184 assumption was verified using the Shapiro–Wilk’s test. Interclass correlation coefficients  
185 (ICC) (absolute agreement) between the first and second 2D:4D’s of the right and left digits  
186 were calculated. Pearson-product moment correlation coefficients were used to determine the  
187 association between 2D:4D,  $\dot{V}O_{2max}$  and its associated ventilatory thresholds. Correlations  
188 were referred to as trivial (0–0.1), small (0.1–0.3), moderate (0.3– 0.5), large (0.5–0.7), very  
189 large (0.7–0.9), nearly perfect ( $>0.9$ ) and perfect (1.0) (Hopkins, et al., 2009). Three multiple  
190 regression analyses with independent variables age, right 2D:4D and left 2D:4D and  
191 dependent variables  $\dot{V}O_{2max}$  or  $V_{T1}$  or  $V_{T2}$  were performed. All statistical analyses were  
192 performed in IBM® SPSS® Statistics, version 26.0, for Windows (SPSS Inc., Chicago, IL,  
193 USA), and the statistical significance was set at  $p < 0.05$ .

### 194 **Results**

195 Two values of digit ratios were calculated. Intra-class correlations coefficients ( $r_I$ , used for  
196 the assessment of the consistency of the measurements) were high and significant for right  
197 2D:4D ( $n = 142$ ,  $r_I = .976$ ,  $F = 82.79$ ,  $p < .0001$ ), left 2D:4D ( $n = 140$ ,  $r_I = .960$ ,  $F = 48.48$ ,  
198  $p < .0001$ ) and Dr-l ( $n = 139$ ,  $r_I = .954$ ,  $F = 42.29$ ,  $p < .0001$ ). The average of the two  
199 measurements was used to obtain the final values for right and left 2D:4D and Dr-l ratios.

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201 Descriptive statistics for the total sample and the sample split by ethnicity are given in Table  
202 1. In comparison to Caucasians, Black players had greater mass, BMI, % body fat, and VO<sub>2</sub>  
203 at VT as well as lower right and left 2D:4D. Therefore, we removed the Black players from  
204 the sample and reported relationships for Caucasians ( $n = 133$ ) only for the following  
205 analyses.

206 There were no significant relationships between digit ratios (right and left and Dr-l) and age  
207 or body size variables ( $r=0.04$  between age and right 2D:4D,  $r= 0.06$  between height and  
208 right 2D:4D,  $r=0.03$  between weight and right 2D:4D,  $r=0.04$  between age and left 2D:4D,  
209  $r=0.06$  between height and left 2D:4D,  $r=0.07$  between weight and left 2D:4D, all  $p>.05$ ).

210 The correlations between digit ratios (right and left and Dr-l), and VO<sub>2max</sub> and ventilatory  
211 thresholds VT1 and VT2 are given in Table 2. Correlations were strongest between digit  
212 ratios and VO<sub>2max</sub>, effect sizes were greatest for right 2D:4D and all correlations were  
213 negative. With regard to VO<sub>2max</sub>, there was a large correlation with right 2D:4D ( $r = -0.65$ ;  
214 Figure 1) and medium correlations with left 2D:4D ( $r = -0.37$ ) and Dr-l ( $r = -0.30$ ). There  
215 were no significant relationships between digit ratios and VT1 ( $r$  varying from  $-0.02$  to -  
216  $0.12$ ). Considering VT2, right 2D:4D showed a moderate correlation ( $r = -0.43$ ) and there  
217 were small correlation coefficients for left 2D:4D and Dr-l (both  $r = -0.21$ ). VO<sub>2max</sub>, V1 and  
218 V2 were interrelated with varying strengths (very large, VO<sub>2max</sub> and VT2,  $r = .73$ ; large, VT1  
219 and VT2,  $r = .59$ ; moderate, VO<sub>2max</sub> and VT1,  $r = .34$ : all  $p<.0001$ ).

220 In addition to the correlations ( $r$ ) for the Caucasian participants, we also considered the total  
221 sample (i.e. Caucasian and Black players,  $n = 143$ ) together with the total sample after  
222 ethnicity effects were removed (standardized regression coefficient,  $b$ ). The values of  $b$  are  
223 presented in parenthesis in Table 2. There was one notable change in  $r$  and  $p$  values, i.e. for  
224 the total sample of Caucasian plus Black players, right 2D:4D was now negatively and

225 significantly related to VT1 ( $r = -.21, p = .01$ ). There were no substantial differences in effect  
226 sizes and  $p$  values between the Caucasian sample and the total sample when ethnicity effects  
227 were removed.

228 Age may influence  $VO_{2max}$ , VT1 and VT2. Therefore, we performed three multiple regression  
229 analyses with independent variables age, right 2D:4D and left 2D:4D and dependent variables  
230  $VO_{2max}$  or VT1 or VT2. With regard to  $VO_{2max}$ , the overall relationship was  $r = 0.67$  ( $r^2 =$   
231  $0.45$ , age  $b = -.08$ ,  $SE = .06$ ,  $p = .25$ , right 2D:4D  $b = -0.61$ ,  $SE = 9.77$ ,  $t = -8.35$ ,  $p < .0001$ ,  
232 left 2D:4D  $b = -0.13$ ,  $SE = 10.81$ ,  $t = -1.80$ ,  $p = 0.08$ ). For VT1 the overall relationship was  $r$   
233  $= 0.21$  ( $r^2 = 0.04$ ). There was a small negative relationship for age but no relationships for  
234 digit ratios (age  $b = -0.17$ ,  $SE = .06$ ,  $t = -1.98$ ,  $p = 0.049$ ). Considering VT2, the overall  
235 relationship was  $r = 0.48$  ( $r^2 = 0.23$ ). There was a small negative relationship with age and a  
236 moderate negative association for right 2D:4D (age  $b = -0.22$ ,  $SE = .06$ ,  $t = -2.82$ ,  $p = 0.006$ ,  
237 right 2D:4D  $b = -0.41$ ,  $SE = 10.40$ ,  $t = -4.84$ ,  $p < .0001$ ). There was no relationship for left  
238 2D:4D.

## 239 **Discussion**

240 Football is an intermittent sport with repeated high-intensity phases. As a result of  
241 improvements in training techniques, football players today are much more similar to  
242 endurance athletes than 50 years ago (Edwards et al., 2003). Therefore, comparisons between  
243 our results and those from endurance athletes are appropriate.

244 Our finding of a mean  $VO_{2max}$  of  $56.05 \pm 4.53$  was close to large sample measures of elite  
245 football players (range, goalkeeper  $50.42 \pm 4.2$  to winger-sides back  $60.53 \pm 5.02$ , median  
246  $58.25$ ; Manari et al., 2016). In our total sample of 143 participants, there were 133  
247 Caucasians and 10 Black football players. The latter differed from the former in their 2D:4D  
248 (Caucasian > Black) and in mass, BMI, % body fat, and  $VO_2$  at VT1. High 2D:4D in  
249 Caucasians and low 2D:4D in Black populations have been reported in a number of studies

250 (Manning, 2002; Butovskaya et al., 2021). Such differences can obscure relationships.  
251 Therefore, the less numerous group was removed and subsequent analyses focused on  
252 Caucasians.

253 With regard to our Caucasian sample, we have found significant negative relationships  
254 between all three-digit ratio variables (right 2D:4D, left 2D:4D and Dr-l) and  $VO_{2max}$ . The  
255 large correlation between right 2D:4D and  $VO_{2max}$  was the strongest of the three associations,  
256 such that right 2D:4D explained 42% of the variance in  $VO_{2max}$ . Associations for left 2D:4D  
257 and Dr-l with  $VO_{2max}$  were medium in strength. There were no significant relationships  
258 between digit ratios and VT1. For VT2, all digit ratio correlations were negative and  
259 significant with a moderate (and strongest) relationship for right 2D:4D and small  
260 correlations for left 2D:4D and Dr-l. Our study is one of the larger studies to consider  
261 relationships between digit ratios and  $VO_{2max}$  and VTs in males. The sample was relatively  
262 homogeneous in that the participants were all male Caucasian professional football players  
263 competing in Leagues 1 and 2, Eastern Mediterranean. Moreover, they can be regarded as  
264 being relatively homogenous in terms of their exercise regime.

265 A similar study by Hill et al., (2012) indicated no association between 2D:4D (right or left)  
266 and  $VO_{2max}$  but reported a significant negative correlation for Dr-l in young athletic teenage  
267 boys of Middle East origin (age:  $13.9 \pm 1.3$  years) during an incremental treadmill test. We  
268 have replicated this latter association in our larger adult male sample. Hill et al., (2012)  
269 participants were drawn from a wide range of sports with different training regimes (soccer,  
270 squash, table tennis and athletics). This may have masked the relationship between right and  
271 left 2D:4D and  $VO_{2max}$ . Importantly, both our present sample and that of Hill et al., (2012)  
272 controlled for ethnicity by considering a single ethnic group.

273 Holzapfel et al., (2016) reported little or no relationship between 2D:4D (Dr-I was not  
274 considered) and  $VO_{2max}$  in a sample of 26 men (13 sedentary and 13 distance runners).  
275 However, they found large negative correlations between 2D:4D and VT. On the contrary, in  
276 our sample, there were no relationships between digit ratios and VT1. The distance runners in  
277 the Holzapfel et al., (2016) study had higher mean  $VO_{2max}$  ( $62.6 \pm 11.2$ ) than our sample of  
278 football players ( $55.91 \pm 4.51$ , Cohen's  $d = .78$ ). However, this was unlikely to account for the  
279 differences as there were large correlations between digit ratios and VT in both their  
280 sedentary and runner samples. Their sample was recruited from the student population of a  
281 South-Eastern US University, and the authors did not report any controls for ethnicity. Thus,  
282 the discrepancies between the Holzapfel et al., (2016) study and the Hill et al., (2012) and the  
283 present study may have arisen as the result of differences in sample size and controls for  
284 ethnicity. In this regard, removal of ethnicity controls in our present study resulted in a  
285 significant relationship between right 2D:4D and VT1.

286 A similar study by Lombardo and Otieno (2020) reported correlations between right 2D:4D  
287 and  $VO_{2peak}$ , VT and Point of Equivalent Change (PEC) in 11 boys who were elite distance  
288 runners. All three variables were negatively related to right 2D:4D with two ( $VO_{2peak}$   $r = -.62$ ;  
289 PEC  $r = -.66$ ) showing significance at  $p < .05$ . However, significance was lost for both when  
290 adjusted for mass. The strength of the correlation with right 2D:4D was similar to that of our  
291 finding for right 2D:4D and  $VO_{2max}$ . These findings suffer from small sample sizes. However,  
292 we judge them to be not incompatible with our findings.

293 With regard to the value of 2D:4D to coaches and scouts. We suggest that 2D:4D may be of  
294 predictive value in sports that are performance-dependent on high values of  $VO_{2max}$  (e.g.  
295 distance running, tennis, rowing & football). Values of 2D:4D appear to be more or less  
296 stable across puberty, thus 2D:4D may yield predictive information in adolescents.

297 An explanation for the links between low 2D:4D and high values of  $VO_{2max}$  and VT2 may lie  
298 in the relationship between 2D:4D and prenatal testosterone. The 2D:4D shows sex  
299 differences throughout the tetrapods and there is multi-species evidence that testosterone  
300 masculinises and oestrogen feminizes 2D:4D (Manning and Fink, 2023). This suggests that  
301 2D:4D is a highly conserved trait that is linked to the early emergence of tetrapods from an  
302 aquatic to a terrestrial existence. This emergence is associated with a suite of traits including  
303 the ability to process gaseous oxygen (Manning and Fink, 2023). Low testosterone  
304 compromises mitochondrial function (Yan et al, 2017) and in human males it is linked to  
305 cardiovascular disease (Harada, 2018). High 2D:4D is associated with elevated fibrinogen  
306 levels and early myocardial infarction (Manning et al, 2019). Thus, our expectation is that  
307 low 2D:4D is related to efficient oxygen metabolism.

308 Our study has a number of limitations. We have not considered non-Caucasian and female  
309 football players as it was not possible to recruit sufficient numbers. Moreover, we suggest  
310 that associations between 2D:4D and oxygen metabolism should be considered in a variety of  
311 sports. These could range from those that require a very high level of aerobic fitness (e.g.  
312 professional cyclists participating in the Girod d'Italia, Tour de France and Vuelta de Espana)  
313 to those in which fitness is somewhat less important (e.g. table tennis).

## 314 **Conclusions**

315 In conclusion, we have found significant negative correlations between digit ratios and  
316  $VO_{2max}$  in 133 professional male football players. They were large (right 2D:4D) and medium  
317 (left 2D:4D, Dr-l) in effect size. For VT2, there were also significant negative correlations,  
318 which were medium (right 2D:4D) and small (left 2D:4D, Dr-l) in effect size. There were no  
319 associations between digit ratios and VT1. All associations were controlled for ethnicity. We  
320 hope these findings help to clarify associations between digit ratios and oxygen metabolism  
321 in men. Further work is necessary to quantify these associations in women.

322 **Figure legends**

323 **Figure 1.** VO<sub>2</sub>max and right 2D:4D ( $r = -.65$ ,  $R^2 = 0.425$ )

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