- 1 Correlations between hamstring muscle architecture, maturation and anthropometric
- 2 measures in academy soccer players
- 3 Running Head: Hamstring architecture and anthropometry
- 4 **Submission Type:** Original Investigation
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- 17 <u>Abstract Word Count: 250</u>
- 18 <u>Text Word Count: 3500</u>
- 19 <u>Number of Figures: 2</u>
- 20 <u>Number of Tables: 4</u>
- 21
- 22

23 Abstract

Purpose: Muscle architecture is associated with motor performance and muscle injury. While muscle architecture and knee-flexor eccentric strength change with growth, the influence of anthropometric measures on these properties is rarely considered. This study aimed to investigate the relationship between hamstring muscle architecture and knee-flexor eccentric strength with

28 anthropometric measurements.

Methods: Sixty male footballers (16.6±1.05years) from the U16, U17 and U19 teams of an elite soccer club were included in this study. Fascicle length, pennation angle and muscle thickness of the bicep femoris long-head (BFlh) and semimembranosus (SM) muscles were measured in both legs using ultrasound. Knee-flexor eccentric strength, height, body mass (BM), leg length, femur length and peak-height velocity (PHV) were measured within 1-week of the ultrasound images. A stepwise regression, and one-way analysis of variance (ANOVA) tests were used to evaluate the effects of age, maturity and anthropometric measurements on muscle properties.

Results: Variance within BFlh and SM muscle thickness (r<0.61), SM pennation angle (r<0.58) and knee-flexor eccentric strength (r=0.50) were highly related to BM. We observed no significant correlations between muscle architecture and age (p>0.29). However, moderately greater BFlh muscle thickness was shown for the post-PHV compared to the PHV group (ES \pm 90%CL;0.72 \pm 0.49).

41 Conclusions: In conclusion, weak correlations between muscle architecture and anthropometric

42 measurements suggests that other factors (i.e., genetics, training regime) influence muscle

43 architecture. The moderate effect of maturity on BFlh muscle thickness strongly suggests post-

- 44 PHV hypertrophy of the BFlh muscle. Our results confirmed previous findings that eccentric knee-
- 45 flexor strength is influenced by BM.

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46 Keywords:

- 47 Musculoskeletal Imaging, Fascicle Length, Pennation Angle, Muscle Thickness, Maturity Offset
- 48

49 Introduction

50 Physical arrangement of muscle fibres, referred to as muscle architecture, is one of the primary 51 drivers of muscle function.¹ It is theoretically accepted that shorter muscle fibres present a lower 52 maximum shortening velocity which likely influence the contraction velocity at the entire muscle 53 level.² In contrast, the angle between the fascicle's line of action and the aponeurosis (*i.e.*, 54 pennation angle) is considered proportional to the number of sarcomeres in parallel and the 55 maximum muscle force-generating capacity.²

In addition to its influence on motor performance, muscle architecture has been associated with 56 muscle strain injuries.³ Longer muscle fascicles are assumed to juxtapose more sarcomeres in series 57 and will exhibit less strain per sarcomere than shorter fascicles for a given muscle-tendon unit 58 strain and stiffness.⁴ During the stance and late-swing phases of sprinting, studies using 59 computational musculoskeletal modeling showed hamstring muscles produce very-high forces and 60 withstand large amounts of negative work over repeated strides.^{5,6} The application of such singular 61 high-magnitude or repeated stress may exceed the local mechanical limits of the hamstring muscle 62 tissue.⁷ In line with such theoretical background, recent evidence suggests that short *bicep femoris* 63 long head (BFlh) fascicle length (<10.56cm) are 4.1 times more likely to sustain a future hamstring 64 injury compared to athletes with longer fascicles.⁸ This risk is increased when short BFlh fascicles 65 are associated with low-levels of eccentric knee-flexor strength. This has led to practitioners 66 67 identifying athletes of greatest hamstring injury risk based on their BFlh fascicle lengths and kneeflexor eccentric strength.^{3,9} Hamstring injuries are increasingly prevalent within soccer populations 68 and account for 12% of all injuries sustained by soccer players.¹⁰ Therefore, the ability to identify 69 soccer players at risk of injury through the investigation and development of hamstring muscle 70 architecture and eccentric strength is becoming increasingly common.¹¹ 71

Muscle architecture measures are commonly determined via B-mode ultrasound images and 72 computed using trigonometry approaches that assume pennate muscle as a parallelogram.¹² 73 74 However, muscle fibres do not consistently present a homogeneous architectural arrangement along their whole length.¹² Further, fascicles are often curved, which is not accounted for when 75 fascicles are represented by a straight line.¹³ Therefore, future works have been encouraged to adopt 76 more appropriate ultrasound methods (e.g., extended field of view (EFOV) imaging) that would 77 enable the exploration of muscles with long fascicles and spatially heterogeneous architecture (i.e., 78 BFlh).^{14,15} 79

While BFlh architecture have been considered as a surrogate of hamstring muscle heads, different 80 muscles have distinct structural arrangements and mechanical properties.¹⁶ It is therefore important 81 to monitor the geometry of the other hamstring muscle heads to capture a better global 82 understanding of the hamstring muscle group.¹⁶ The fascicles of the semimembranosus (SM) 83 muscle head are pennate thus, possess a similar architecture to that of the BFlh while the fascicle 84 length of a muscle with a fusiform arrangement (*i.e.*, *semitendinosus*) is likely related to femur 85 length and player size,¹⁶ which is largely related to biological age. Further, maturity leads to 86 increased body mass (BM) and fat-free mass.¹⁷ However, little is known regarding how the 87 maturation process influences muscle architecture. Literature suggests that muscle thickness and 88 fascicle length increase while pennation angle remains stable throughout maturation.^{18,19} One study 89 showed an increase in gastrocnemius medialis and vastus lateralis (VL) muscle thickness, 90 pennation angle, and VL fascicle length from pre-to-post peak height velocity (PHV).¹⁷ Overall, 91 this data suggests that muscle architecture changes with growth. However, the influence BM and 92

height may respectively have on muscle architecture and knee-flexor eccentric strength is rarely
 considered.²⁰ Such investigations may contribute (i) to differentiate between training-induced
 adaptations versus normal maturation-induced changes and (ii) to identify which anthropometrical
 measurements share relationships with hamstring muscle architecture.

The main aim of this study was to evaluate relationships between hamstring muscle properties involved in motor performance and injury risk (*i.e.*, fascicle length, pennation angle, muscle

99 thickness, knee-flexor eccentric strength) and anthropometric measurements within a population

- 100 of highly trained youth soccer players. Additionally, this study aimed to identify age and maturation
- 101 effects on hamstring architecture and knee-flexor eccentric strength.

102 Methods

103 **Participants**

Sixty male footballers (16.6±1.05years, 174.4±7.4cm, 63.8±9.2kg) including 17 participants from

the Under-16 (15.3 ± 0.4 years, 170.9 ± 10.1 cm, 59.9 ± 11.2 kg), 17 participants from the Under-17 (16.4 ± 0.4 years, 174.7 ± 7.5 cm, 65.2 ± 9.7 kg) and 26 participants from the Under-19 (17.5 ± 0.7 years,

106 (10.4 ± 0.4 years, 174.7 ± 7.5 cm, 05.2 ± 9.7 kg) and 20 participants from the Order-19 (17.5 ± 0.7 years, 107 177.5 ± 4.5 cm, 66.3 ± 6.8 kg) teams of an elite French Ligue-1 football club partook in this study.

Participants, who represented all football playing positions (goalkeepers = 5, defenders = 21, $\frac{1}{2}$

midfielders = 20, forwards = 14), joined the club at 13-years old thus, their experience of $\frac{1}{2}$

professional football training ranged from 2-5 years depending on their age. Since all athletes

111 competed in the same sport, potential confounding effects of different training regimes on muscle

architecture were unlikely. Each team followed the same training model established by the football

113 club in which each training day focused on the development of the same specific attributes (i.e.,

strength, aerobic, technical, tactical) and all teams played matches of 90 minutes. Participants

115 completed an average of five 90-minute training sessions, one game and one rest day per-week.

116 Design

117 During the first 3 weeks of preseason training, athletes had muscle architecture measurements taken

for the BFlh and SM hamstring muscles from both legs on one occasion using ultrasound. Peak

119 knee-flexor eccentric strength measurements using a Nordbord (Vald Performance, Queensland

120 Australia) and anthropometric measurements (BM, height, sitting height, leg length and femoral

121 length) were taken within one week of the ultrasound scans.

122 Ultrasound scans were taken pre-training to minimize any acute effects soccer-specific training 123 may have on knee-flexor muscle architecture. As the preseason starts dates were staggered by one 124 week (i.e., U17 started one week later than Under-19 and Under-16 started 2 weeks later than 125 Under-19) the ultrasound scans were all completed within 1-week of each players' preseason start 126 date to minimize any knee-flexor muscle architecture adaptations induced by soccer-specific 127 training following the off season.

All knee-flexor eccentric strength testing was undertaken pre-training following 24 hours of rest
 without physical exertion. Each player completed a standardized warm-up protocol before
 completing the testing. The warm-up consisted of 5 minutes of light cycling (>80 - <120 watts) on

a static gym bike, 2x 10 repetitions of unilateral Swiss ball rollouts per leg and 3 submaximal

132 Nordic hamstring exercise repetitions. Verbal encouragement was provided to the players

throughout the testing procedure.

134 Athlete monitoring procedures, data collection and anonymized data publication, were accepted as

part of the participant's contractual agreement with the football club. In addition, the club gave

136 consent for the research and publication of its findings thus, additional ethical approval was not

required for this study however, it complied to the declaration of Helsinki.²¹ Participants were excluded from the study if there were injured at the time of testing or were absent due to illness.

139 Methodology

140 Ultrasound Imaging and Processing

141 The BFlh and SM of each leg were scanned in lying prone position using an ultrasound device (Aixplorer V11, Supersonic Imagine, Aix-en-Provence, France) and transducer (2–10MHz, SL10-142 2, Supersonic Imagine). The proximal (i.e., conjoint tendon of the BFlh and semitendinosus 143 muscles) and distal musculo-tendinous junctions were located. Cross-sectional images were 144 acquired in the transversal plane to determine the path of the BFlh muscle. Scans were then 145 performed longitudinally along this path in EFOV panoramic mode in order to not extrapolate the 146 nonvisible part of the fascicle.¹³ This mode uses algorithms that stitches successive frames together 147 to obtain panoramic images. Scans were performed by following fascicles in the superficial 148 compartment from the proximal insertion following the fascicle's plane while trying to manipulate 149 the transducer, so the fascicles remained continuous while superficial and deep aponeuroses were 150 visible. The path of the best image was marked over the skin to position the transducer during 151 EFOV scans. Scans were performed along the muscle midline until reaching the distal portion, at 152 approximately 90% of the femur length (Fig.1A). The transducer was moved slowly and 153 154 continuously along the marked path with a constant pressure from the distal to the proximal musculo-tendinous junctions while transducer orientation was continuously adjusted to stay in the 155 fascicle plane. Total scan time was 10–15s per scan. This was repeated for each muscle until two 156 images with clear, visible fascicles and aponeuroses were obtained. 157

The muscle insertion, superficial aponeurosis, deep aponeurosis, and fascicles were then manually 158 digitised using the ImageJ multipoint tool (ImageJ v.1.48; Bethesda, MD). For SM and BFlh 159 160 muscles, superficial and deep aponeurosis and four clearly visible fascicles spreading throughout the muscle distally, medially, and proximally were required. As fascicles cannot consistently be 161 imaged over their entire course, each fascicle was digitized over ten points of its clearly visible 162 163 (*i.e.*, echogenic) portions (Fig.1B). The same procedure was used to label aponeuroses. The x-y coordinates of all labelled points were recorded (Fig.1C) and fitted using a second-degree 164 polynomial order separately applied for each aponeurosis and fascicle (Fig.1D) using custom-165 written scripts (Origin 2020, OriginLab, USA). The coefficients of the polynomial fit were used to 166 produce a dataset over an evenly distributed 10-points comprised: (i) between the insertions of each 167 fascicle on the superficial and deep aponeurosis; (ii) between the most distal and proximal digitized 168 points for each aponeurosis. Fascicle length was computed as the sum of the distance between each 169 pair of points. Pennation angle was calculated as the average of the angle computed at 25, 50, 75 170 and 100% of the fascicle length to accommodate for angle spatial variability throughout the muscle. 171 This procedure was applied for each fascicle and values were averaged across images and fascicles 172 173 totaling 40 measured fascicles per player.

174 Muscle thickness was measured from the superficial to the deep aponeurosis using the average of

three measurements at 33%, 50% and 66% of the length of the muscle, commencing at the upper insertion to evenly represent the muscle helly.

176 insertion to evenly represent the muscle belly.

- 177 Standardized typical error \pm 90% confidence internals of fascicle length measurements averaged
- between both legs for the BFlh was 0.19 ± 0.06 with a coefficient of variation $\pm 90\%$ confidence internals of 2.9 ± 0.9
- 179 internals of 2.9 ± 0.9 .

180 Standardized typical error \pm 90% confidence internals of fascicle length measurements averaged

between both legs for the SM was 0.18 ± 0.06 with a coefficient of variation $\pm 90\%$ confidence internals of 3.2 ± 0.9 .

183 The fascicles of the semitendinosus hamstring muscle head have a fusiform arrangement where 184 they run in parallel with the aponeuroses' throughout the length of the muscle thus, it was not 185 possible to accurately identify the origin and endpoint of the fascicles and therefore not possible to 186 accurately measure the muscle architecture using the EFOV ultrasound technique.¹⁶ In addition, 187 the BFlh and SM muscles are more commonly injured than the semitendinosus thus, are of greater 188 interest within this context.¹⁶

189

Insert Figure 1 here.

190 Femoral length

191 A Cescorf aluminum large-bone anthropometer sliding caliper (60cm) was used to measure femoral

192 lengths. Participants stood in a neutral position and measurements were taken from the superior

193 point on the greater trochanter of the femur to the superior point on the lateral border of the head

- of the tibia. Measurements were repeated 3-times and averaged on each leg to ensure precision.
- 195 Standardized typical error \pm 90% confidence internals of femoral length measurements averaged 196 between both legs was 0.04 \pm 0.01 with a coefficient of variation \pm 90% confidence internals of
- 197 0.25 ± 0.1 .

198 **Biological maturity**

- 199 Biological maturity was determined using years from PHV. Participants were categorized into three
- 200 maturity groups–1.Pre-PHV (Maturity offset=<-1), 2.PHV (Maturity offset=-1<x>1), 3.Post-PHV

201 (Maturity offset=>1).¹⁷ Maturity offset was calculated using the following equation for measuring

- 202 sex-specific PHV for males:
- 203 Maturity Offset=-29.769+0.0003007*leg length and sitting height interaction-0.01177*age and leg
- length interaction+0.01639*age and sitting height interaction+0.445*leg by height ratio.²²
- 205 In this equation, interactions refer to the multiplication of the two factors involved (*i.e.*, leg length 206 and sitting height interaction=leg length*sitting height).

No participants qualified for the pre-PHV category; thus, comparisons were performed between the circa-PHV (n = 15, age = 15.4 years, height = 166.2 cm, body mass = 53.8 kg, maturity offset = 0.4 au) and post-PHV (n = 45, age = 16.6 years, height = 177.2 cm, body mass = 67.1, maturity offset = 2.1 au) categories.

The Mirwald equation for calculating maturity offset exhibited similar levels of accuracy and reliability as other equations designed to calculate biological $age.^{23}$

213 Knee-flexor eccentric strength

- 214 Knee-flexor eccentric strength was assessed using a Nordbord. Data was collected using a protocol
- 215 previously outlined by Opar et al.²⁴ Participants regularly carried out eccentric hamstring strength

exercises, including the Nordic hamstring exercise twice weekly within their normal trainingprograms so were familiar with this test.

218 Anthropometric Measurements

Participant standing and sitting height were measured using a portable SECA 213 stadiometer 219 (SECA, Hamburg, Germany). Participants were instructed to remove any footwear and stand on 220 the highlighted foot markers on the base of the stadiometer with their hips, back and back of the 221 head all in contact with the stadiometer support and to keep the head within the Frankfort horizontal 222 223 plane (e.g., upper ear canal aligned with lower orbitals). The stadiometer arm was lowered until it made contact with the most superior part of the head. The participant was then asked to take a deep 224 breath in a nd hold this while the measurement was taken. This measurement was repeated three 225 times and the average calculated to ensure a consistent measurement was taken.²⁵ 226

- To measure sitting height, the same protocol was used but the height was measured between a platform where the base of the stadiometer was placed. The participants were instructed to sit on
- the stadiometer base (on the platform) and the stadiometer arm was lowered to the most superior
- 230 point of the participant's head where the measurement was then taken once the participant had
- taken a deep breath.²⁶ Body mass was calculated using a HD-366 Digital Weight Scale (Tanita, IL,
- US) and were collected following previously outlined procedures.²⁵

233 Statistical Analysis

Data are presented as Mean±SD, 90% Confidence Intervals. Data which were not normally 234 distributed were log transformed to minimise bias from non-uniformity error. One-way analysis of 235 variance (ANOVA) tests were performed to analyse the variance of muscle architecture with age 236 and maturity offset. Models were created using R software (v3.4.1, R Foundation for Statistical 237 Computing) using the MASS package step function (v7.3) to perform a backward elimination 238 stepwise-regression to analyse relationships between muscle architecture and knee-flexor eccentric 239 strength as dependent variables with anthropometric measures as independent variables. 240 Significance was set at p<0.05 for ANOVA and stepwise-regression tests. Linear-regressions were 241 performed using Excel (Microsoft, Washington, USA) where the r-value was calculated to analyse 242 the strength of relationships between muscle architecture and anthropometric measures. The 243 magnitude of the correlation coefficients were calculated using Hopkin's scale: ≤ 0.1 (very small), 244 0.1-0.3 (small), 0.3-0.5 (moderate), 0.5-0.7 (high), 0.7-0.9 (very-high), ≥0.9 (almost perfect).²⁷ 245 Using a custom Excel spreadsheet,²⁸ effect sizes were calculated to determine the magnitude of 246 differences between age-groups (U16vsU17, U16vsU19, U17vsU19) and maturity offset groups 247 (circa PHV vs Post-PHV) using Hopkin's scale: 0.2 (Small), 0.6 (Moderate), 1.2 (Large), 2.0 248 (Very-Large).²⁷ The likelihood to obtain a meaningful change was assessed with Magnitude based 249 decision framework where the following thresholds were used: 25-75% (possible), 75-95% 250 (likely), 95-99% (very-likely), >99% (almost-certain).²⁷ The effect was reported as unclear if the 251 probabilities of the effect being positive and negative were >5%.²⁷ The effects were otherwise 252 reported as the observed value.²⁷ 253

254 **Results**

255 Age effect on muscle architecture

We observed no significant correlations between BFlh fascicle length (p=0.98), SM fascicle length (p=0.94), BFlh pennation angle (p=0.62), SM pennation angle (p=0.29), BFlh muscle thickness

- 258 (p=0.72) and SM muscle thickness (p=0.72) with age group (Table 1).
- 259

Insert table 1 here.

260 Maturity offset effect on muscle architecture

Moderately greater BFlh muscle thickness was shown for the post-PHV category compared to the PHV category (ES±90%CI;0.72±0.49). *Unclear* SM muscle thickness differences were observed between PHV and post-PHV groups (0.16±0.67;Table 2).

264 *Unclear* differences for BFlh (0.29 ± 0.70) and SM (-0.02 ± 0.55) fascicle lengths were also found 265 between PHV and post-PHV groups. Additionally, PHV and post-PHV differences in pennation 266 angles were *unclear* for BFlh (0.31 ± 0.78) and SM (0.07 ± 0.65) muscles.

267

Insert table 2 here.

268 Relationship between muscle architecture and anthropometry

The relationships between muscle architecture measures and femoral length are shown in figure 2. Small correlations were found between muscle architecture and femoral length (r<0.12).

Table 3 shows the relationships between muscle architecture and anthropometric measures. The

- predictor model was able to account for 24% of the variance observed in BFlh muscle thickness
- 273 (r=0.49) and 37% in SM muscle thickness (r=0.61) with BM significantly related to both measures
- 274 (*p*=0.001).

Weak correlations were found between the BFlh fascicle length and predictor model (r=0.34) where BFlh fascicle length was significantly related to femoral length (p=0.033) and leg length (p=0.012). Strong correlations were found between SM pennation angle and the anthropometric predictors (r=0.58). Within this model, SM pennation angle was significantly related to BM (p<0.001) and femoral length (p=0.025).

280

281

Insert figure 2 here.

Insert table 3 here.

Relationships between muscle architecture, anthropometry and knee-flexor eccentric strength

Mean \pm SD knee flexor eccentric strength test scores for each team were: U16; 281 \pm 80 N, U17;

 336 ± 75 N and U19; 295 ± 69 N respectively. Regarding knee flexor eccentric strength test

- scores in relation to maturation status, the circa-PHV and post PHV groups scored as follows:
- 287 circa-PHV; 281 ± 37 N, post-PHV; 309.2 ± 85 N. No significant relationships were observed
- between knee-flexor eccentric strength and BFlh and SM architecture (Table 4). A large
- relationship was observed between knee-flexor eccentric strength and BM (p=0.001,r=0.50).
- 290

Insert table 4 here.

291 **Discussion**

The main aim of this study was to evaluate relationships between hamstring muscle properties involved in motor performance, injury risk and anthropometric data in a substantial cohort of 60 highly trained male youth footballers. Three main findings originate from this study: (i) there were small relationships between hamstring muscle architecture and anthropometric measures, with leg length most notably accounting for 3.8% of the variance in BFlh fascicle length, (ii) knee-flexor eccentric strength was strongly related with BM, (iii) significantly higher BFlh muscle thickness was shown for post-PHV compared to the PHV category.

299 We observed weak relationships between muscle architecture and anthropometric measurements. Only a slight portion of the BFlh fascicle length variance was explained by anthropometric 300 301 measurements with leg length accounting for 3.8% of this. Additionally, femoral length accounted for 4.5% of SM pennation angle variance. This suggests that muscle architecture depends, in part 302 on lower-limb segment size. Musculoskeletal imaging is therefore required to accurately appraise 303 individual hamstring muscle architecture to integrate these properties for training individualization 304 purposes. Previous research has shown BFlh muscles with fascicles shorter than 10.56cm are 4.1 305 times more likely to sustain a future hamstring injury compared to athletes with longer fascicles.⁸ 306 As anthropometric measurements cannot be accountable for all variance observed in muscle 307 308 architecture, musculoskeletal imaging is required to accurately measure static-resting fascicle length and pennation angle to estimate exposure to injury risk. Additionally, these findings suggest 309 it is not necessary to control for athlete size when analysing team muscle architecture data. 310 Furthermore, regular monitoring of muscle architecture using ultrasound can provide information 311 regarding training effects on muscle development and can be used to monitor accelerated changes 312 during earlier growth periods.¹⁵ This may be useful to assess rehabilitation process effectiveness 313 for injured players that may be exposed to persistent atrophy²⁹ and reduced force-generating 314 capacity³⁰ as reported in BFlh after muscle injury. Thus, hamstring architecture during injury 315 rehabilitation can be compared to baseline-levels to evaluate how rehabilitation processes 316 317 counterbalance injury-mediated changes in muscle geometry. Therefore, it has been suggested that 318 where possible, a specialised figure with expertise in musculoskeletal imaging should be introduced into teams interested in implementing such approaches.¹⁵ 319

Our results suggest it is not possible to solely use basic anthropometric measurements to estimate 320 321 hamstring architecture. This finding is of importance for investigations using computational models to explore behaviors (*i.e.*, dynamic-length changes) of hamstring muscle fibres during 322 323 ecological motor tasks such as running or sprinting^{5,6}. Such approaches use cadaveric data or MR images to implement muscle-tendon unit length to be able to estimate BFlh fibre length changes. 324 325 However, our results strengthen that approaches based on generalized models may not be sufficiently personalized to reflect actual hamstring muscle fascicle dynamics, which requires 326 direct assessment of muscle geometry. In this context and given that other factors strongly 327 influence muscle architecture (i.e., genetics, training level), direct measurements from 328 musculoskeletal imaging are required to obtain accurate appraisal of muscle architecture. Similarly, 329 330 to previous research, where factors such as eccentric hamstring training and exposure to sprint running were assessed as to how they affected hamstring muscle architecture,¹¹ future studies may 331 investigate this further to investigate which specific training factors influence hamstring 332 architecture within highly trained, youth football players. 333

Our findings showed the presence of a strong relationship between knee-flexor eccentric strength and BM measured using the Nordic hamstring exercise, with BM accounting for 25% of kneeflexor eccentric strength variance. These results reflect those of a previous study in which BM

accounted for 30% of knee-flexor eccentric strength variance.²⁰ To account for the effect of BM, 337 allometric scaling could be utilized to correct Nordic hamstring test scores to provide relative 338 strength to BM outputs.²⁰ As our study shows a quarter of knee-flexor eccentric strength is 339 accounted for by BM, it is suggested to use allometric scaling to remove BM influence. Allometric 340 scaling allows for the minimisation of the effect of BM on Nordic hamstring scores, thus, it is 341 possible to assess true changes in knee-flexor eccentric strength.²⁰ Additionally, it allows accurate 342 comparisons to be made between athletes within the same team regardless of BM to assess 343 individual athlete performance against baseline values to potentially improve performance and 344 minimise injury risks. However, knee-flexor eccentric strength did not share any further 345 346 meaningful relationships with other anthropometric or hamstring architecture measurements. This did not support previous studies where greater knee-flexor eccentric strength was observed with 347 greater lever-arm (e.g., femoral length) and hamstring fascicle length.^{2,16} Numerous factors 348 influence knee-flexor eccentric strength (i.e., muscle volume, neural drive, muscle activation, 349 specific tension, force-length relationship, force-velocity relationship, inter-muscle coordination). 350 It is therefore possible the influence these factors had, while they may have been small, 351 352 accumulated to account for a proportion of the remaining variance observed for knee-flexor 353 eccentric strength in this cohort.

No meaningful differences in muscle architecture were observed between age-groups. However, 354 only a 6.6cm height difference was observed across all age-groups and only a 1.1kg BM difference 355 between the U17 and U19 age-groups. This modest range of variability across ages may partly 356 357 explain why hamstring muscle architecture did not share a relationship with age-group. Regarding relationships between muscle architecture and maturity offset, moderately greater BFlh muscle 358 359 thickness was found for the post-PHV group compared with the PHV group. This is supported by previous research where muscle thickness of the gastrocnemius medialis and vastus lateralis 360 increased for the post-PHV group compared to the PHV and pre-PHV groups.¹⁷ Previous research 361 reported similar increases in muscle size and hypertrophy for post-PHV participants.³¹ This finding 362 is likely to reflect the growth-induced development of contractile material which translated into the 363 amount of force the footballers could produce. However, further research is required to investigate 364 365 why maturity offset impacted BF but not SM muscle thickness. The growth-related muscle hypertrophy observed in this study was associated with no changes in pennation angles or fascicle 366 367 length of BFlh and SM. This did not support previous reports of significantly larger pennation angle and fascicle length for post-PHV individuals.¹⁷ Together with previous findings, this study 368 highlights the importance of using maturity offset to make comparisons between adolescent 369 athletes rather than age. Research has shown athletes at different stages of maturity respond more 370 effectively to different training programs.^{32,33} Therefore, it is paramount to ensure athletes of the 371 same age but different stages of maturity are not compared under the same protocols^{17,18} so training 372 can be individualized to certify the safe, constructive development of each athlete. 373

Regarding the limitations associated with this study, the participants all play and train within the 374 375 same club. Thus, other clubs and cohorts of participants may display different relationships due to 376 differences in training regime and exposure to strength training. Therefore, it is important that these results are not generalized across youth football and data would need to be collected on an 377 individual club basis to explore this research within different populations. One limitation of this 378 379 study may be that no pre-PHV athletes were present within the testing cohort thus, it was not possible to compare muscle architecture between all three maturity offset categories as performed 380 in previous studies.^{17,31} This investigation should be further expanded to include younger age-381

groups within the cohort to evaluate the differences in muscle architecture, anthropometric and 382 383 knee-flexor eccentric strength measures between pre-PHV, PHV and post-PHV groups. However, the present sample is relatively large compared to existing literature. Using ultrasound scans to 384 385 assess muscle geometry could be a relevant area of common work between performance and clinical staff to expand hamstring architecture, anthropometric and knee-flexor eccentric strength 386 reference values and improve understanding of hamstring muscle geometry in youth athletes. 387 Additionally, it is important to note that we did not completely control the participant's training 388 regimen. While slight differences in training contents may exist across age groups, all players 389 trained in the same environment, likely resulting in negligible subsequent effect on hamstring 390 391 muscle architecture. This assumption is strengthened by previous works from our group showing modest changes in hamstring muscle architecture even after high-volume eccentric training.³⁴ 392 Finally, the authors would like to acknowledge recent criticisms of magnitude based decision 393 framework and they understand other statistical methods may be preferred.³⁵ However, we believe 394 robust statistical methods have been used to analyze the data and provide accurate results from 395 which to draw appropriate conclusions. 396

397 **Practical Applications**

- Controlling for anthropometric measures is not necessary when screening hamstring muscle architecture.
- BM allometric scaling is required to make between-player Nordic hamstring strength comparisons.
- 402 Using maturity offset measures for screening may allow practitioners to better differentiate
 403 muscle adaptations induced by maturation or training effects however, more data is required
 404 to investigate this further.
- 405 Ultrasound neuromuscular imaging of the hamstring muscle group may work in 406 conjunction with traditional neuromuscular testing batteries to provide further information 407 regarding hamstring muscle architecture.

408 **Conclusions**

In conclusion, this study showed that muscle properties are poorly associated with anthropometric measurements, suggesting it is not necessary to control for anthropometric measurements when considering muscle variables as part of a screening process for injury prevention strategies. Therefore, musculoskeletal imaging is required to accurately measure muscle architecture within a practical environment. Additionally, this study supports previous findings regarding the large influence of BM on knee-flexor eccentric strength performance thus, allometric scaling should be used when between-player comparisons are required.²⁰

416 Acknowledgements

The authors would like to thank Simon Avrillon and Antonio Morales for sharing their expertise in ultrasound imaging prior to the testing for this study and Joffrey Bardin for sharing his expertise on maturation and maturity offset calculations.

420 **References**

Lieber RL, Fridén J. Functional and clinical significance of skeletal muscle architecture. *Muscle Nerve*. Nov 2000;23(11):1647-66. doi:10.1002/1097-4598(200011)23:11<1647::aid-mus1>3.0.co;2-m

423 2. Lieber RL, Ward SR. Skeletal muscle design to meet functional demands. Philos Trans R Soc Lond 424 B Biol Sci. May 2011;366(1570):1466-76. doi:10.1098/rstb.2010.0316 425 3. Bourne MN, Duhig SJ, Timmins RG, et al. Impact of the Nordic hamstring and hip extension 426 exercises on hamstring architecture and morphology: implications for injury prevention. Br J Sports Med. 427 Mar 2017;51(5):469-477. doi:10.1136/bjsports-2016-096130 428 Franchi MV, Fitze DP, Raiteri BJ, Hahn D, SpÖrri J. Ultrasound-derived Biceps Femoris Long Head 4. 429 Fascicle Length: Extrapolation Pitfalls. Med Sci Sports Exerc. 01 2020;52(1):233-243. 430 doi:10.1249/MSS.000000000002123 431 Schache AG, Dorn TW, Blanch PD, Brown NA, Pandy MG. Mechanics of the human hamstring 5. 432 muscles during sprinting. Med Sci Sports Exerc. Apr 2012;44(4):647-58. 433 doi:10.1249/MSS.0b013e318236a3d2 434 Fiorentino NM, Blemker SS. Musculotendon variability influences tissue strains experienced by 6. 435 the biceps femoris long head muscle during high-speed running. J Biomech. Oct 2014;47(13):3325-33. 436 doi:10.1016/j.jbiomech.2014.08.010 Kalkhoven JT, Watsford ML, Impellizzeri FM. A conceptual model and detailed framework for 437 7. 438 stress-related, strain-related, and overuse athletic injury. J Sci Med Sport. Aug 2020;23(8):726-734. 439 doi:10.1016/j.jsams.2020.02.002 440 Timmins RG, Bourne MN, Shield AJ, Williams MD, Lorenzen C, Opar DA. Short biceps femoris 8. 441 fascicles and eccentric knee flexor weakness increase the risk of hamstring injury in elite football 442 (soccer): a prospective cohort study. Br J Sports Med. Dec 2016;50(24):1524-1535. doi:10.1136/bjsports-443 2015-095362 444 9. Green B, Bourne MN, van Dyk N, Pizzari T. Recalibrating the risk of hamstring strain injury (HSI): 445 A 2020 systematic review and meta-analysis of risk factors for index and recurrent hamstring strain 446 injury in sport. Br J Sports Med. Sep 2020;54(18):1081-1088. doi:10.1136/bjsports-2019-100983 447 Ekstrand J, Hägglund M, Waldén M. Epidemiology of muscle injuries in professional football 10. 448 (soccer). Am J Sports Med. Jun 2011;39(6):1226-32. doi:10.1177/0363546510395879 449 11. Mendiguchia J, Conceição F, Edouard P, et al. Sprint versus isolated eccentric training: 450 Comparative effects on hamstring architecture and performance in soccer players. PLoS One. 451 2020;15(2):e0228283. doi:10.1371/journal.pone.0228283 12. 452 Blazevich AJ, Gill ND, Zhou S. Intra- and intermuscular variation in human quadriceps femoris 453 architecture assessed in vivo. J Anat. Sep 2006;209(3):289-310. doi:10.1111/j.1469-7580.2006.00619.x 454 Franchi MV, Raiteri BJ, Longo S, Sinha S, Narici MV, Csapo R. Muscle Architecture Assessment: 13. 455 Strengths, Shortcomings and New Frontiers of in Vivo Imaging Techniques. Ultrasound Med Biol. 12 456 2018;44(12):2492-2504. doi:10.1016/j.ultrasmedbio.2018.07.010 457 14. Pimenta R, Blazevich AJ, Freitas SR. Biceps Femoris Long-Head Architecture Assessed Using 458 Different Sonographic Techniques. Med Sci Sports Exerc. 12 2018;50(12):2584-2594. 459 doi:10.1249/MSS.000000000001731 460 15. Sarto F, Spörri J, Fitze DP, Quinlan JI, Narici MV, Franchi MV. Implementing Ultrasound Imaging 461 for the Assessment of Muscle and Tendon Properties in Elite Sports: Practical Aspects, Methodological 462 Considerations and Future Directions. Sports Med. Mar 2021;doi:10.1007/s40279-021-01436-7 463 16. Kellis E. Intra- and Inter-Muscular Variations in Hamstring Architecture and Mechanics and Their 464 Implications for Injury: A Narrative Review. Sports Med. Oct 2018;48(10):2271-2283. 465 doi:10.1007/s40279-018-0975-4 466 Radnor JM, Oliver JL, Waugh CM, Myer GD, Lloyd RS. The Influence of Maturity Status on Muscle 17. 467 Architecture in School-Aged Boys. *Pediatr Exerc Sci*. 05 2020;32(2):89-96. doi:10.1123/pes.2019-0201 468 18. O'Brien TD. Musculoskeletal Proportionality, Biomechanical Considerations, and Their 469 Contribution to Movement in Adults and Children. Pediatr Exerc Sci. May 2016;28(2):210-6.

470 doi:10.1123/pes.2015-0160

471 19. Kubo K, Teshima T, Hirose N, Tsunoda N. Growth changes in morphological and mechanical 472 properties of human patellar tendon in vivo. J Appl Biomech. Jun 2014;30(3):415-22. 473 doi:10.1123/jab.2013-0220 474 Buchheit M, Cholley Y, Nagel M, Poulos N. The Effect of Body Mass on Eccentric Knee-Flexor 20. 475 Strength Assessed With an Instrumented Nordic Hamstring Device (Nordbord) in Football Players. Int J 476 Sports Physiol Perform. Sep 2016;11(6):721-726. doi:10.1123/ijspp.2015-0513 477 21. Association WM. Declaration of Helsinki. . Accessed 07/12/2020, 2020. 478 https://www.wma.net/policies-post/wma-declaration-of-helsinki-ethical-principles-for-medical-479 research-involving-human-subjects/ 480 22. Mirwald RL, Baxter-Jones AD, Bailey DA, Beunen GP. An assessment of maturity from 481 anthropometric measurements. Med Sci Sports Exerc. Apr 2002;34(4):689-94. doi:10.1097/00005768-482 200204000-00020 483 23. Mills K, Baker D, Pacey V, Wollin M, Drew MK. What is the most accurate and reliable 484 methodological approach for predicting peak height velocity in adolescents? A systematic review. J Sci 485 Med Sport. Jun 2017;20(6):572-577. doi:10.1016/j.jsams.2016.10.012 486 Opar DA, Williams MD, Timmins RG, Hickey J, Duhig SJ, Shield AJ. Eccentric hamstring strength 24. 487 and hamstring injury risk in Australian footballers. Med Sci Sports Exerc. Apr 2015;47(4):857-65. 488 doi:10.1249/MSS.000000000000465 489 JD MacDougall HW, HJ Green. Physiological testing of the high-performance athlete. Medicine & 25. 490 Science in Sports & Exercise; 1993. p. 305. 491 T Massard JF, R Duffield, T Wignell, R Lovell. Comparison of sitting height protocols used for the 26. 492 prediction of somatic maturation. SPSR; 2019. p. 1-4. Hopkins WG, Marshall SW, Batterham AM, Hanin J. Progressive statistics for studies in sports 493 27. 494 medicine and exercise science. Med Sci Sports Exerc. Jan 2009;41(1):3-13. 495 doi:10.1249/MSS.0b013e31818cb278 Hopkins W. Spreadsheets for analysis of controlled trials with adjustment for a predictor. Sports 496 28. 497 Sci. Accessed 16/06/2021, 2021. 498 29. Silder A, Heiderscheit BC, Thelen DG, Enright T, Tuite MJ. MR observations of long-term 499 musculotendon remodeling following a hamstring strain injury. Skeletal Radiol. Dec 2008;37(12):1101-9. 500 doi:10.1007/s00256-008-0546-0 Avrillon S, Hug F, Guilhem G. Bilateral differences in hamstring coordination in previously injured 501 30. 502 elite athletes. J Appl Physiol (1985). 03 2020;128(3):688-697. doi:10.1152/japplphysiol.00411.2019 503 Camachoa JDH. Peak height velocity and muscle mass in young soccer players. In: Leal ABH, 31. 504 editor.: Spanish Journal of Human Nutrition and Dietetics; 2018. p. 219-226. 505 32. Meylan CM, Cronin JB, Oliver JL, Hopkins WG, Contreras B. The effect of maturation on 506 adaptations to strength training and detraining in 11-15-year-olds. Scand J Med Sci Sports. Jun 507 2014;24(3):e156-64. doi:10.1111/sms.12128 508 Rodríguez-Rosell D, Franco-Márquez F, Mora-Custodio R, González-Badillo JJ. Effect of High-33. 509 Speed Strength Training on Physical Performance in Young Soccer Players of Different Ages. J Strength Cond Res. Sep 2017;31(9):2498-2508. doi:10.1519/JSC.000000000001706 510 511 34. Lacome M, Avrillon S, Cholley Y, Simpson BM, Guilhem G, Buchheit M. Hamstring Eccentric 512 Strengthening Program: Does Training Volume Matter? Int J Sports Physiol Perform. Apr 2019:1-27. 513 doi:10.1123/ijspp.2018-0947 514 Sainani KL, Lohse KR, Jones PR, Vickers A. Magnitude-based Inference is not Bayesian and is not a 35. 515 valid method of inference. Scand J Med Sci Sports. Sep 2019;29(9):1428-1436. doi:10.1111/sms.13491

516

Figures



Figure 1. Typical example of the methods employed to extract muscle architecture from a ultrasound extended field of view scan of the semimembranosus muscle (A). Superficial and deep aponeuroses, and clearly visible fascicles (between 3 to 5 for each scan, 4 in the current example) are first labelled over 10 points from the ultrasound image using Image J software (B). The x-y coordinates of the label dots are recorded (C). The coordinates of the two aponeuroses and fascicles are then fitted using a second-degree polynomial order function to finally compute the fascicle length and pennation angle (D). Fascicle length was computed as the sum of the distance between each point of the fit. Pennation angle was computed as the average of the pennation angle computed at 25, 50, 75 and 100% of the fascicle length between the two aponeuroses. (E). An example of an image captured that was of slightly lower quality. The lower aponeurosis is more difficult to identify towards the proximal and distal ends of the image.



Figure 2. Linear regression graphs showing the relationships between the femoral length of the participants compared to muscle architecture measures (fascicle length, pennation angle and muscle thickness) for the *bicep femoris* long head (BFlh) and *Semimembranosus* (SM) muscles.

Tables

	Mean±SD			ANOVA	Effect Size±90%CI; Likelihood (%)						
Fascicle Length	U16	U17	U19	<i>p</i> -value	U16 vs U17		U16 vs U19		U17 vs	U19	
Bicep Femoris (cm) Semimembranosus	7.79 ± 0.98	7.73 ± 1.20	7.72 ± 1.22	0.98	-0.08 ± 0.42	13/56/31	-0.18 ± 0.52	11/42/47	-0.10 ± 0.63	21/40/39	
(cm)	5.93 ± 1.20	5.81 ± 1.04	5.83 ± 0.92	0.94	-0.08 ± 0.58	21/43/36	-0.13 ± 0.61	18/40/43	-0.05 ± 0.61	24/42/34	
Pennation Angle	11.71 ±	12.22 +	12.33 ±			N'O					
Bicep Femoris (°) Semimembranosus	1.52 18.27 ±	2.15 19.41 ±	2.36 18.01 ±	0.62	0.21 ± 0.40	52/43/4	0.38 ± 0.46	74/24/2	0.16 ± 0.66	46/36/17	
(°)	3.52	3.14	2.26	0.29	0.38 ± 0.58	70/25/5	0.06 ± 0.64	35/40/25	-0.32 ± 0.54	6/29/65	
Muscle Thickness											
Bicep Femoris (cm) Semimembranosus	2.09 ± 0.23	2.07 ± 0.16	2.13 ± 0.30	0.72	-0.05 ± 0.36	12/64/24	0.09 ± 0.64	39/40/22	0.15 ± 0.72	45/34/21	
(cm)	2.03 ± 0.23	2.13 ± 0.39	2.08 ± 0.42	0.72	0.25 ± 0.55	57/35/9	-0.04 ± 0.56	24/46/31	-0.29 ± 0.72	13/29/58	

Table 1. Comparison between muscle architecture measures (fascicle length, pennation angle and muscle thickness) of different age groups; Analysis of variance (ANOVA), effect size ± 90% CI and the likelihood to obtain a meaningful change. Magnitude based decisions (Likelihood) is reported as the percentage probability that the observed differences are negative/trivial/positive compared to the measure by which the comparison is being made.

PROOF A

	Mean±SD		ANOVA	PHV vs Post-PHV			
Fascicle Length	PHV	Post-PHV	<i>p</i> -value	Effect Size±90%CI	Likelihood (%)		
Bicep Femoris (cm)	7.61 ± 0.77	7.72 ± 1.20	0.74	0.29 ± 0.70	59/29/12		
Semimembranosus (cm)	5.85 ± 1.12	5.84 ± 1.01	0.99	-0.02 ± 0.55	25/47/28		
Pennation Angle					3		
Bicep Femoris (°)	11.53 ± 1.66	12.29 ± 2.03	0.22	0.31 ± 0.78	60/27/13		
Semimembranosus (°)	18.33 ± 3.77	18.55 ± 2.74	0.82	0.07 ± 0.65	37/40/23		
Muscle Thickness				C .	,		
Bicep Femoris (cm)	2.01 ± 0.14	2.11 ± 0.23	0.12	0.72 ± 0.49	96/4/0		
Semimembranosus (cm)	1.96 ± 0.22	$\begin{array}{c} 2.07 \pm \\ 0.32 \end{array}$	0.25	0.16 ± 0.67	46/36/18		

Table 2. Comparison between muscle architecture measures (fascicle length, pennation angle and muscle thickness) of different maturity offset groups; Analysis of variance (ANOVA), effect size

 \pm 90% CI and the likelihood to obtain a meaningful change. Magnitude based decisions (Likelihood) is reported as the percentage probability that the observed differences are negative/trivial/positive compared to the measure by which the comparison is being made.

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		<i>p</i> - value								
	R-	Body	Femoral		Leg					
Fascicle Length	squared	Mass	Length	Height	Length	Age				
Bicep Femoris	0.119	0.359	0.033*	0.856	0.012*	0.843				
Semimembranosus	0.101	0.318	0.561	0.418	0.409	0.395				
Pennation Angle										
Bicep Femoris	0.053	0.291	0.109	0.435	0.104	0.614				
Semimembranosus	0.341	<0.001*	0.025*	0.053	0.754	0.623				
Muscle Thickness						0				
Bicep Femoris	0.244	0.001*	0.971	0.942	0.543	0.099				
Semimembranosus	0.376	<0.001*	0.342	0.54	0.637	0.037*				

eigende aus inscientionense (st. 1996) inscientionense (Table 3. Stepwise regression results to identify relationships between anthropometric measures (body mass, femoral length, height, leg length and age) and muscle architecture measures (fascicle length, pennation angle and muscle thickness) for the bicep femoris long head (BFlh) and semimembranosus (SM) muscles.

	_	p - values								
	R-				BFlh		BFlh		BFlh	
	squared	Body Mass	Age	Height	FL	SM FL	PA	SM PA	MT	SM MT
Knee-flexor eccentric Strength (N)	0.316	0.001*	0.369	0.079	0.082	0.321	0.088	0.873	0.135	0.084

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Table 4. Stepwise regression results to identify relationships between knee-flexor eccentric strength and both anthropometric (bodymass, age, height) and muscle architecture measures (BFlh = *bicep femoris* long head, SM = *semimembranosus*, FL = fascicle length,PA = pennation angle, MT = muscle thickness).