

1 **Title:**

2 Biceps femoris long head architecture, eccentric knee flexor strength and hamstring injury risk in
3 professional football (soccer): a prospective cohort study.

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24 **ABSTRACT**

25 **Background/Aim:** To investigate the role of eccentric knee flexor strength, between-limb
26 imbalance and biceps femoris long head (BF_{lh}) fascicle length on the risk of a future hamstring
27 strain injury (HSI). **Methods:** Elite soccer players (n=152) from eight different teams
28 participated. Eccentric knee flexor strength during the Nordic hamstring exercise and BF_{lh}
29 fascicle length were assessed at the beginning of pre-season. The occurrences of a HSI following
30 this were recorded by the team medical staff. Relative risk (RR) was determined for univariate
31 data, and logistic regression was employed for multivariate data. **Results:** Twenty-seven new
32 HSIs were reported. Eccentric knee flexor strength below 337N (RR = 4.4; 95% CI = 1.1 to 17.5)
33 and BF_{lh} fascicles shorter than 10.56cm (RR = 4.1; 95% CI=1.9 to 8.7) significantly increased
34 the risk of a subsequent HSI. Multivariate logistic regression revealed significant effects when
35 combinations of age, previous history of HSI, eccentric knee flexor strength and BF_{lh} fascicle
36 length were explored. From these analyses the likelihood of a future HSI in older athletes or
37 those with a previous HSI history was reduced if high levels of eccentric knee flexor strength and
38 longer BF_{lh} fascicles were present. **Conclusions:** The presence of short BF_{lh} fascicles and low
39 levels of eccentric strength in elite soccer players increase the risk of a future HSI. The greater
40 risk of a future HSI in older players or those with a previous HSI is reduced when they possess
41 longer BF_{lh} fascicles and high levels of eccentric strength.

What are the new findings:

- Possessing short BF_{lh} fascicles (a newly identified risk factor) increased the risk of a future hamstring strain injury
- Low levels of eccentric knee flexor strength increased the risk of a hamstring strain injury occurring in the subsequent season
- The increased risk associated with increasing age and a history of hamstring strain injury can be mitigated with greater levels of eccentric knee flexor strength and longer BF_{lh} fascicle lengths.

42 INTRODUCTION

43 Paragraph 1

44 Hamstring strain injuries (HSI) are the most prevalent cause of lost playing and training time in
45 elite soccer and account for approximately 37% of all muscle strain injuries¹⁻³. Of these HSIs the
46 majority occur in the biceps femoris long head (BF_{lh})¹⁻³. Despite a concerted scientific effort
47 over the past decade, the incidence of HSIs has not declined in elite soccer⁴. What is known is
48 that a number of non-modifiable risk factors, including increasing age and previous injury
49 history, have been shown to increase the risk of a future HSI in elite soccer⁵⁻⁷. More recently
50 greater attention has been directed to modifiable risk factors that can be altered via a range of
51 interventions⁸⁻¹⁰. These risk factors include isokinetically derived eccentric knee flexor strength
52 ¹⁰ and muscle imbalances (between-limb and hamstring:quadriceps ratios)^{10 11}.

53 In addition a recent prospective cohort study in elite Australian Rules Football identified
54 eccentric weakness during the Nordic hamstring exercise as risk factor for a future HSI⁹. This
55 study showed that there was a decreased risk of sustaining a future HSI in older athletes and
56 those with a prior HSI if coupled with high levels of eccentric knee flexor strength⁹. Despite this
57 evidence, there is still no consensus regarding the role that eccentric knee flexor strength plays in
58 the aetiology of a HSI in soccer and this warrants further attention¹².

59 Paragraph 2

60 Despite a lack of direct evidence, it has been proposed that hamstring muscle fascicle length may
61 alter the risk for a future HSI¹³⁻¹⁵. One retrospective study has shown BF_{lh} fascicles are shorter in
62 previously injured muscles than in the contralateral uninjured muscles¹⁶, but due to the
63 retrospective nature of the available evidence¹⁶, it is not possible to determine if these

64 differences in fascicle length increased the risk of a HSI occurring or were the result of the initial
65 insult.

66 **Paragraph 3**

67 The purposes of this study were to determine if eccentric knee flexor strength and between-limb
68 imbalances during the Nordic hamstring exercise and BF_{th} fascicle length influenced the risk of a
69 future HSI in elite Australian soccer players. Additionally, this study aimed to assess the
70 interrelationship between these two modifiable factors (fascicle length and eccentric strength)
71 and the non-modifiable risk factors of increasing age and previous HSI in determining the risk of
72 a future HSI. It was hypothesized that shorter BF_{th} fascicle lengths, low levels of eccentric knee
73 flexor strength and larger between-limb imbalances would be associated with an increased risk
74 of HSI. The interaction between increasing age and a previous HSI history with eccentric
75 strength and BF_{th} fascicle length provide novel information for an athlete's risk profile.

76 **METHODS**

77 **Participants and study design**

78 **Paragraph 4**

79 This prospective cohort study was completed during pre-season (June 2014 to July 2014) and in-
80 season period (October 2014 to May 2015) of the 2014/2015 elite, professional Australian
81 Football (soccer) competition. Ethical approval for the study was granted by the Australian
82 Catholic University Human Research Ethics Committee (approval number: 2014 26V). Eight of
83 the ten invited teams elected to take part in the study. Recent staffing changes resulted in two
84 teams deciding not to participate. All outfield members of the playing squad (approximately 18-
85 22 athletes per team) were approached and provided written, informed consent. In total, 152 elite
86 male football (soccer) players participated in this study. Club medical staff completed a

87 retrospective injury questionnaire that detailed each athlete's history of hamstring, quadriceps,
88 groin and calf strain injuries and chronic groin pain in the past 12 months, as well as the history
89 of anterior cruciate ligament (ACL) injury at any stage throughout the athlete's career. Playing
90 positions were defined as: defender (n=52), midfielder (n=59) and attacker (n=41) as per
91 previous research¹⁷. The athletes had their maximal voluntary isometric contraction strength
92 (n=141) (MVIC), BF_{th} architecture (with relaxed hamstrings (n=152) and while performing
93 isometric knee flexion at 25% of MVIC (n=141)) and eccentric knee flexor strength (n=131)
94 assessed at the beginning of pre-season. Some athletes did not complete the maximal eccentric
95 and isometric strength assessments at the advice of their team's medical department.

96 **BF_{th} architecture assessment**

97 **Paragraph 5**

98 Muscle thickness, pennation angle and fascicle length of the BF_{th} was determined from
99 ultrasound images taken along the longitudinal axis of the muscle belly utilising a two
100 dimensional, B-mode ultrasound (frequency, 12Mhz; depth, 8cm; field of view, 14 x 47mm) (GE
101 Healthcare Vivid-*i*, Wauwatosa, U.S.A). The scanning site was determined as the halfway point
102 between the ischial tuberosity and the knee joint fold, along the line of the BF_{th}. All architectural
103 assessments were performed with participants in a prone position and the hip neutral following at
104 least 5 minutes of inactivity. Assessments at rest were always performed first followed by an
105 isometric contraction protocol. During all assessments of the BF_{th} architectural characteristics
106 (passive and 25% of MVIC), the knee joint was fully extended. Assessment of the MVIC of the
107 knee flexors was undertaken in the same position and was performed in a custom made device¹⁸
108 ¹⁹. Participants were instructed to contract their knee flexors maximally over a five second
109 period. The peak force value during this effort was used to determine their MVIC strength. The

110 assessment of the BF_{lh} architectural characteristics during a 25% isometric contraction then
111 occurred in the same position and device, with the participants shown the real-time visual
112 feedback of the force produced to ensure that target contraction intensities were met. To gather
113 ultrasound images, the linear array ultrasound probe, with a layer of conductive gel was placed
114 on the skin over the scanning site, aligned longitudinally and perpendicular to the posterior thigh.
115 Care was taken to ensure minimal pressure was placed on the skin by the probe as this may
116 influence the accuracy of the measures²⁰. Finally, the orientation of the probe was manipulated
117 slightly by the sonographer (RGT) if the superficial and intermediate aponeuroses were not
118 parallel. Ultrasound image analysis was undertaken off-line (MicroDicom, Version 0.7.8,
119 Bulgaria). For each image, six points were digitised as described by Blazeovich and colleagues²¹.
120 Following the digitising process, muscle thickness was defined as the distance between the
121 superficial and intermediate aponeuroses of BF_{lh}. A fascicle of interest, which was the clearest
122 and could be seen across the entire field of view, was outlined and marked on the image. The
123 angle between this fascicle and the intermediate aponeurosis was measured and given as the
124 pennation angle. The aponeurosis angle for both aponeuroses was determined as the angle
125 between the line marked as the aponeurosis and an intersecting horizontal reference line across
126 the captured image^{21 22}. Fascicle length was determined as the length of the outlined fascicle
127 between aponeuroses. As the entire fascicle was not visible in the field of view of the probe it
128 was estimated via the following equation from Blazeovich and colleagues^{21 22}:

129
$$FL = \sin(AA + 90^\circ) \times MT / \sin(180^\circ - (AA + 180^\circ - PA))$$

130 where FL=fascicle length, AA=aponeurosis angle, MT=muscle thickness and PA=pennation
131 angle. Fascicle length was reported in absolute terms (cm) and relative to BF_{lh} length. The same
132 assessor (RGT) collected and analysed all scans and was blinded to participant identifiers during

133 the analysis. Reliability of the assessor (RGT) and processes used for the determination of the
134 BF_{th} architectural characteristics have been reported ¹⁶.

135 **Eccentric hamstring strength**

136 **Paragraph 6**

137 The assessment of eccentric knee flexor strength using the Nordic hamstring device has been
138 reported previously ^{9 16 18 19}. Participants were positioned in a kneeling position over a padded
139 board, with the ankles secured superior to the lateral malleolus by individual ankle braces that
140 were secured atop custom made uniaxial load cells (Delphi Force Measurement, Gold Coast,
141 Australia) fitted with wireless data acquisition capabilities (Mantracourt, Devon, UK). The ankle
142 braces and load cells were secured to a pivot that ensured that force was always measured
143 through the long axis of the load cells. Following a warm up set of three submaximal efforts with
144 a subsequent 1 minute rest period, participants were asked to perform one set of three, maximal
145 bilateral repetitions of the Nordic hamstring exercise. Participants were instructed to gradually
146 lean forward at the slowest possible speed while maximally resisting this movement with both
147 lower limbs while keeping the trunk and hips in a neutral position throughout, and the hands held
148 across the chest. Verbal encouragement was given throughout the range of motion to ensure
149 maximal effort.

150 **Prospective hamstring strain injury reporting**

151 **Paragraph 7**

152 A HSI was defined as any acute posterior thigh pain that resulted in the immediate cessation of
153 exercise and was later diagnosed by the club medical staff. The injury diagnosis also included the
154 presence of pain during an isometric contraction and during any knee flexor muscle length test
155 (stretch). Injury reports were not completed for injuries that did not fulfil the criteria (e.g. acute

156 posterior thigh pain, however completed the exercise). A recurrent injury was a HSI that
157 occurred on the same side of the body that had already suffered an injury in the current season.
158 For all recurrent and new HSIs that fit the above criteria, the club medical staff completed a
159 standard injury report form that detailed which limb was injured (dominant/non dominant,
160 left/right), the muscle injured (BF_{th}/biceps femoris short
161 head/semimembranosus/semitendinosus), location of injury (proximal/distal, muscle
162 belly/muscle-tendon junction), activity type performed at time of injury (e.g running, kicking
163 etc), grade of injury (I, II or III) ^{23 24} and the number of days taken to return to full participation
164 in training/competition. These reports were forwarded to the investigators throughout the season.

165 **Injury specifics and rates**

166 **Paragraph 8**

167 The determination of playing time missed as a result of a HSI was measured as missed matches
168 per club per season ²⁵. Recurrence rate was defined as the number of recurrent injuries in the
169 same season as a percentage of new injuries ²⁵. Additionally time lost as a result of the injury
170 was defined as the amount of days from when the injury occurred to the resumption of full
171 training participation.

172 **Data analysis**

173 **Paragraph 9**

174 Whilst positioned in the custom made device, shank length (m) was determined as the distance
175 from the lateral tibial condyle to the mid-point of the brace that was placed around the ankle.
176 This measure of shank length was used to convert the force measurements (collected in N) to
177 torque (Nm). Knee flexor eccentric and MVIC strength force data were transferred to a personal
178 computer at 100Hz through a wireless USB base station (Mantracourt, Devon, UK). The peak

179 force value during the MVIC and the three Nordic hamstring exercise repetitions for each of the
180 limbs (left and right) was analysed using custom made software. Eccentric knee flexor strength,
181 reported in absolute terms (N and Nm) and relative to body mass (N/kg and Nm/kg), was
182 determined as the average of the peak forces from the 3 repetitions for each limb, resulting in a
183 left and right limb measure¹⁸. Knee flexor MVIC strength, reported in absolute terms (N and
184 Nm) and relative to body mass (N/kg and Nm/kg), was determined as the peak force produced
185 during a 5 second maximal effort for each limb.

186 **Paragraph 10**

187 Between limb imbalance of BF_{lh} fascicle length, muscle thickness, eccentric and MVIC knee
188 flexor strength was calculated as a left:right limb ratio for the uninjured players and as an
189 uninjured:injured limb ratio in the injured players. As recommended, between limbs imbalance
190 was converted to a percentage difference using log transformed raw data followed by back
191 transformation²⁶. Negative percentage imbalances indicate that the variable of the left limb was
192 greater than the right limb in the uninjured players, or that the injured limb was variable was
193 greater than the uninjured limb in the injured players. For athletes who did not suffer a HSI, as
194 the limbs did not differ for any variables ($p>0.05$) the left and right limb were averaged to give a
195 single control 'score'.

196 **Statistical analyses**

197 **Paragraph 11**

198 All statistical analyses were performed using JMP version 11.01 Pro Statistical Discovery
199 Software (SAS Inc., Cary, North Carolina, USA). Where appropriate, data were screened for
200 normal distribution using the Shapiro-Wilk test and homoscedasticity using Levene's test.

201 **Paragraph 12**

202 The mean and standard deviation of age, height, weight, BF_{lh} fascicle length (passive and 25%
203 MVIC), BF_{lh} muscle thickness (passive and 25%MVIC), eccentric and MVIC knee flexor
204 strength were determined for all participants. Univariate analyses were performed to compare
205 between limb imbalances for all variables of the injured and uninjured groups, as well as
206 comparing the injured limb to the contralateral uninjured limb and the average of the left and
207 right limbs from the uninjured group. Univariate comparisons were undertaken using two-tailed
208 t-test with Bonferonni corrections to account for multiple comparisons. To determine univariate
209 relative risk (RR) and 95% confidence intervals (95% CI) of future HSI, athletes were grouped
210 according to:

- 211 • those with or without prior
 - 212 ○ hamstring (past 12 months)
 - 213 ○ calf (past 12 months)
 - 214 ○ quadriceps (past 12 months)
 - 215 ○ ACL (at any stage in their career)
 - 216 ○ chronic groin injury (past 12 months)
- 217 • those with passive fascicle lengths above or below
 - 218 ○ 10.56cm
 - 219 ■ This threshold was determined utilising receiver operator characteristic
 - 220 (ROC) curves based on the fascicle threshold that maximised the
 - 221 difference between sensitivity and 1- specificity.
- 222 • those with 25% MVIC fascicle lengths above or below
 - 223 ○ 9.61cm

- 224 ▪ Threshold determined as above
- 225 • those with passive muscle thickness threshold above or below
- 226 ○ 2.35cm
- 227 ▪ Threshold determined as above
- 228 • those with 25% MVIC muscle thickness threshold above or below
- 229 ○ 2.61cm
- 230 ▪ Threshold determined as above
- 231 • those with average eccentric knee flexor strength threshold above or below
- 232 ○ 337N
- 233 ▪ Threshold determined as above
- 234 • those with MVIC knee flexor strength threshold above or below
- 235 ○ 400N
- 236 ▪ Threshold determined as above
- 237 • those with limbs above or below arbitrarily selected cut offs of 10%, 15% and 20%
- 238 between limb imbalance for
- 239 ○ passive fascicle length
- 240 ○ 25% MVIC fascicle length
- 241 ○ average eccentric knee flexor strength
- 242 ○ MVIC knee flexor strength
- 243 • athletes above these age cut offs (which represent the 10th, 25th, 50th, 75th and 90th
- 244 percentiles for this sample)
- 245 ○ 18.0 years
- 246 ○ 20.4 years

- 247 ○ 23.7 years
- 248 ○ 28.8 years
- 249 ○ 32.6 years
- 250 • athletes above and below the height (182.3cm) and weight (77.9kg) means as defined
- 251 previously by Hagglund and colleagues ²⁷

252

253 **Paragraph 13**

254 HSI rates from these groups were then compared and RR calculated utilising a two-tailed
255 Fisher's exact test to determine significance. Additionally, univariate logistic regressions were
256 conducted with the prospective occurrence of a HSI (yes/no) as the dichotomous dependant
257 variable and eccentric knee flexor strength and BF_{th} fascicle length as continuous independent
258 variables in separate analyses. These data are reported as odds ratios (OR) and 95% CI per 10-N
259 increase in knee flexor force and 0.5cm increase in fascicle length.

260 **Paragraph 14**

261 As per a previous investigation in elite Australian Football ⁹, to improve the understanding of the
262 risk from the univariate analysis and remove the possible confounding effects, multivariate
263 logistic regression models were built using risk factors from previously published evidence ^{1-3 5 9}.
264 The first model included passive fascicle length (average of both limbs) and history of HSI and
265 their interaction. The second model included fascicle length (average of both limbs) and age and
266 their interaction. The third model included mean eccentric strength (average of both limbs) and
267 history of HSI and their interaction. The fourth model included mean eccentric strength (average
268 of both limbs) and age and their interaction. The final model included both fascicle length
269 (average of both limbs) and mean eccentric strength (average of both limbs) and their interaction.

270 Additionally for this final model the Nagelkerke R^2 coefficient was used to display the strength
271 of the association between the two continuous independent variables (eccentric strength and
272 fascicle length) with a prospective HSI occurrence²⁸. Significance was set at a $p < 0.05$ and where
273 possible Cohen's d ²⁹ was reported for the effect size of the comparisons, with the levels of effect
274 being deemed small ($d = 0.20$), medium ($d = 0.50$) or large ($d = 0.80$) as recommended by Cohen
275 (1988).

276 **RESULTS**

277 **Power calculations**

278 **Paragraph 15**

279 Power analysis was undertaken *post-hoc* using G-Power. Using BF_{th} architecture data, power
280 was calculated as 0.97 for the use of two-tailed independent t-tests to compare groups (input
281 parameters: effect size = 0.80; alpha = 0.05; sample size group 1 = 125; sample size group 2 =
282 27). Using a similar *post-hoc* comparison for eccentric knee flexor strength, power was
283 calculated as 0.95 (input parameters: effect size = 0.80; alpha = 0.05; sample size group 1 = 105;
284 sample size group 2 = 26).

285 **Participant and injury details**

286 **Paragraph 16**

287 One-hundred and fifty two athletes were assessed at the beginning of pre-season (age 24.8 ± 5.1
288 years; height 1.80 ± 0.06 m; body mass 76.9 ± 7.5 kg). One hundred and twenty five did not sustain
289 a HSI (age 24.2 ± 5.1 years; height 1.78 ± 0.06 m; body mass 75.3 ± 6.6 kg) and 27 did (age 27.0 ± 3.8
290 years; height 1.80 ± 0.07 m; body mass 76.4 ± 6.7 kg). The athletes who went on to be injured
291 displayed no differences in height and weight, but were significantly older than those who did

292 not suffer an injury (mean difference: 2.8 years; 95% CI=1.1 to 4.5; $p=0.002$; $d=0.62$). Twenty-
293 seven initial HSIs were sustained (11 left limb, 16 right limb) and of these, eight went on to
294 reoccur in the same season (recurrence rate=29.6%). Of the initial injuries, ten occurred during
295 the pre-season period, with the remaining seventeen occurring during the competitive season.
296 The total amount of matches missed as a result of a HSI (initial and recurrent) was sixty three,
297 resulting in 7.8 matches missed per club for the competitive season. Of the 27 initial injuries, the
298 average time lost was 17.7 (± 9.3) days, with the eight recurrent injuries resulting in an average of
299 28.4 (± 23.7) days.

300 **Paragraph 17**

301 Of the twenty-seven initial HSIs, 88.8% occurred in the BF_{th}, with the remaining 11.2%
302 occurring in the semimembranosus (7.5%) and semitendinosus (3.7%), respectively. The primary
303 mechanism for the initial injuries was high speed running (81.5%), followed by stretching for a
304 ball or opponent (11.1%) and then kicking (7.4%). All recurrences occurred during high speed
305 running. No injuries occurred during the Nordic hamstring exercise testing sessions. The
306 distribution of player positions in the injured group (defender: 29.6%, midfielder: 37.1%,
307 attacker: 33.3%) compared to the uninjured group (defender: 36.8%, midfielder: 40.0%, attacker:
308 23.2%) suggested that defenders were under-represented and attackers over-represented in the
309 subsequently injured group.

310 **Univariate analysis**

311 **Paragraph 18**

312 Eccentric and isometric knee flexor strength, BF_{th} architectural characteristics and between limb
313 asymmetries of the injured and uninjured limbs from the injured players and the average of both
314 limbs from the uninjured players can be found in Table 1.

315 **BF_{lh} architectural characteristics**

316 **Paragraph 19**

317 The subsequently injured limbs had shorter BF_{lh} fascicle lengths than the two-limb-average of
318 uninjured players when assessed at rest (mean difference: 1.37cm; 95% CI=0.8 to 1.8; $p<0.001$;
319 $d=1.08$; Table 1) and during 25% MVIC (mean difference: 1.02cm; 95% CI=0.5 to 1.5;
320 $p<0.001$; $d=0.92$; Table 1). In comparison to the contralateral uninjured limb, the BF_{lh} fascicle
321 length of the subsequently injured limbs was significantly shorter when assessed at rest (mean
322 difference: 1.05cm; 95% CI=0.6 to 1.5; $p<0.001$; $d=0.91$; Table 1) and during 25% MVIC
323 (mean difference: 0.65cm; 95% CI=0.3 to 1.0; $p<0.001$; $d=0.57$; Table 1). Whereas, the BF_{lh}
324 architectural characteristics of the left and right limbs in the uninjured players were not
325 significantly different when assessed in when relaxed or during 25% MVICs ($p>0.05$).

326 Using univariate logistic regression, BF_{lh} fascicle length (OR = 0.261; 95% CI = 0.10 to 0.57;
327 $p=0.002$) had a significant inverse relationship with the incidence of prospectively occurring
328 HSIs. For every 0.5cm increase in BF_{lh} fascicle length, the risk of HSI was reduced by 73.9%.
329 Muscle thickness measures of the BF_{lh} (at rest and during 25% MVIC) from the subsequently
330 injured limbs were no different from either the contralateral uninjured limbs or the two-limb-
331 average of the uninjured players ($p<0.05$, d range=0.13 to 0.23; Table 1).

332 **Paragraph 20**

333 The measures of between limb asymmetry in BF_{lh} fascicle length and muscle thickness, assessed
334 at rest and at 25% MVIC, did not differ significantly between the injured and uninjured players
335 ($p<0.05$, d range=0.03 to 0.48; Table 1).

336 **Eccentric and isometric knee flexor strength**

337 **Paragraph 21**

338 Between-limb differences in absolute eccentric knee flexor forces between the left and right
339 limbs of uninjured players and between the subsequently injured and contralateral uninjured
340 limbs of injured players, were not significant ($p > 0.05$, d range = 0.02 to 0.21; Table 1). However,
341 between group comparisons of absolute eccentric knee flexor force showed that subsequently
342 injured limbs were weaker ($260.6\text{N} \pm 82.9$) than the two-limb-average of uninjured players
343 ($309.5\text{N} \pm 73.4$) (mean difference: 48.9N ; 15.8%; 95% CI = 16.2 to 81.5N ; $p = 0.004$; $d = 0.62$; Table
344 1). Additionally, the uninjured limbs of the injured players were also significantly weaker
345 ($262.6\text{N} \pm 63.2$) than the uninjured players' two-limb-average (mean difference: 46.9N ; 15.1%;
346 95% CI = 15.9 to 77.9N ; $p = 0.003$; $d = 0.68$; Table 1).

347 Eccentric strength represented as knee flexor torque showed similar differences, with the
348 subsequently injured limbs ($115.2\text{Nm} \pm 37.1$) being weaker than the two-limb-average
349 ($135.5\text{Nm} \pm 33.7$) of uninjured players (mean difference: 20.3Nm ; 14.9%; 95% CI = 5.3 to
350 35.1Nm ; $p = 0.008$; $d = 0.57$; Table 1). Similarly, the uninjured limbs ($116.2\text{Nm} \pm 28.7$) from the
351 injured players were weaker than the two-limb-average of the uninjured players ($135.5\text{Nm} \pm 33.7$;
352 mean difference: 19.3Nm ; 14.2%; 95% CI = 4.9 to 33.4Nm ; $p = 0.008$; $d = 0.62$; Table 1).

353 Using univariate logistic regression, eccentric knee flexor strength (OR = 0.910; 95% CI = 0.85
354 to 0.97; $p = 0.004$) had a significant inverse relationship with the incidence of prospectively
355 occurring HSIs. For every 10N increase in eccentric knee flexor strength, the risk of HSI was
356 reduced by 8.9%. Comparisons of between-limb imbalance in eccentric knee flexor strength did
357 not differ between the subsequently injured and uninjured players (mean difference: 9.6%; 95%
358 CI = -3.6 to 22.7; $p = 0.147$; $d = 0.40$; Table 1).

359 **Paragraph 22**

360 There were no significant differences in knee flexor MVIC strength between either the
361 subsequently injured limbs or the contralateral uninjured limbs of the injured players and the
362 two-limb-averages of uninjured players ($p>0.05$; d range=0.07 to 0.22; Table 1)

363 **Relative Risk**

364 **Paragraph 23**

365 The univariate relative risks of a future HSI associated with all variables examined can be found
366 in Table 2. Athletes with a relaxed BF_{lh} fascicle length shorter than that of the ROC-curve-
367 determined threshold of 10.56cm (area under the curve = 0.71; sensitivity = 0.70; 1-specificity =
368 0.29) were 4.1 times more likely to suffer a subsequent HSI than those with longer fascicles (RR
369 = 4.1; 95% CI=1.9 to 8.7; $p<0.001$). Similar RR values were seen for BF_{lh} fascicle length
370 assessed during 25% MVIC (Table 2). Furthermore, athletes with average eccentric knee flexor
371 forces below the ROC-curve determined threshold of 337N (area under the curve = 0.65;
372 sensitivity = 0.96; 1-specificity = 0.68) had 4.4 times greater risk of a subsequent HSI than
373 stronger players (RR = 4.4; 95% CI=1.1 to 17.6; $p=0.013$). Similar RR values were seen for the
374 other measures of knee flexor strength (torque, force/kg body mass and torque/kg body mass)
375 (Table 2). No measure of MVIC strength or between-limb imbalance in this measure led to a
376 statistically significant increase in RR (Table 2).

377 **Multivariate logistic regression**

378 **Paragraph 24**

379 Details of all of the logistic regression models can be found in Table 3 and Figures 1 to 5. All of
380 the models were significant (model 1: prior HSI and BF_{lh} fascicle length, $p<0.001$; model 2: age
381 and BF_{lh} fascicle length; $p<0.001$; model 3: prior HSI and eccentric strength, $p=0.009$; model 4:

382 age and eccentric strength, $p=0.007$; model 5: eccentric strength and BF_{lh} fascicle length;
383 $p<0.001$), however none of the interactions reached significance (Table 3). For all models in
384 which fascicle length was included, it made the most significant contribution to the model. A
385 Nagelkerke R^2 coefficient of 0.31 was found, when using a binary logistic regression, to
386 determine the strength of the association between the two continuous independent variables
387 (eccentric strength and fascicle length) with the dependant variable of a prospective HSI
388 occurrence (yes/no).

389 **DISCUSSION**

390 **Main findings**

391 **Paragraph 25**

392 This is the first study that has examined the role that BF_{lh} fascicle length plays in the aetiology of
393 HSI. The main findings were that 1) athletes that suffered a HSI contained shorter BF_{lh} fascicle
394 lengths than those that remained uninjured; 2) athletes that suffered a HSI were weaker during
395 eccentric contractions than those who remained uninjured; 3) eccentric between-limb imbalances
396 were not different between the injured or uninjured groups and between-limb imbalances did not
397 infer any increased HSI risk; 4) the probability of future HSI associated with non-modifiable
398 factors (increasing age and a history of HSI) appears to be influenced by BF_{lh} fascicle length and
399 eccentric knee flexor strength and 5) measures of MVIC knee flexor strength were not different
400 between the injured and uninjured groups and did not infer any increased HSI risk.

401 **BF_{lh} fascicle length and the risk of a future HSI**

402 **Paragraph 26**

403 In the current study short BF_{th} fascicle lengths were associated with an increased risk of future
404 HSI in elite soccer players. One previous retrospective investigation reported that individuals
405 with a unilateral HSI history have shorter BF_{th} fascicles in the previously injured limb than the
406 contralateral uninjured limb¹⁶. It was previously hypothesized that shorter fascicles, with fewer
407 in-series sarcomeres, may be more susceptible to being over-stretched and having damage
408 caused by powerful eccentric contractions, like those performed during the terminal swing phase
409 of high speed running^{13 30}. Given that more than two thirds of the HSIs noted in the current
410 study occurred during high speed running, the shorter BF_{th} fascicle lengths in the subsequently
411 injured limbs may have increased the susceptibility of the muscle to damage and altered their
412 HSI risk.

413 **Knee flexor strength and HSI risk**

414 **Paragraph 27**

415 Low levels of eccentric knee flexor strength during the Nordic hamstring exercise increased the
416 risk of a future HSI in elite soccer players. This has also been recently observed in elite
417 Australian footballers⁹. As the hamstrings are required to contract eccentrically during the
418 terminal swing phase of the gait cycle³¹, low levels of eccentric strength may reduce the
419 hamstrings ability to do this and as a result potentially lead to an acute injury. Interestingly, low
420 levels of isometric knee flexor strength were not associated with future HSI rates and this
421 suggests that the contraction mode of strength tests is a critical factor in determining their
422 predictive value. This is of particular relevance given that isometric assessments of the knee-
423 flexors have been developed and advocated as clinically convenient³² and minimally ‘intrusive’
424 in athlete training programs³³ given the low levels of muscle damage and soreness involved.
425 Without discounting the value and convenience of such isometric tests as measures of strength

426 and indicators of fatigue ³³, the present results suggest that eccentric hamstring tests are of
427 greater value in determining injury risk.

428 **Between-limb imbalance and HSI risk**

429 **Paragraph 28**

430 The current study also found that a larger between-limb strength imbalance during the Nordic
431 hamstring exercise did not increase the risk of future HSI and this is consistent with a similar
432 recent study in AFL players ⁹ but contrary to previous findings in elite soccer, which indicated
433 that isokinetically derived between-limb eccentric strength imbalances are associated with an
434 increased risk of HSI ¹¹. Bourne and colleagues have also recently observed, in a prospective
435 study, that between-limb imbalances in the Nordic strength test (as employed in this study) are
436 associated with elevated HSI rates in rugby union players while absolute strength levels are not
437 ³⁴. The diverse findings in these studies are hard to explain. The different physical demands of
438 these three football codes are readily apparent ³⁴and the mode of testing may also influence the
439 results of these prospective studies.

440 **Multivariate comparisons**

441 **Paragraph 29**

442 Multivariate exploration into combinations of variables including BF_{lh} fascicle length, eccentric
443 strength, age and a HSI history provides novel insights regarding HSI risk. Advanced age and a
444 history of HSI have both been previously reported to increase the risk of a future HSI in elite
445 soccer⁵⁻⁷. The data in the current study indicates that the risk of a future HSI is lower in older
446 athletes or those who have a previous history of HSI when coupled with longer BF_{lh} fascicle
447 lengths and/or high levels of eccentric knee flexor strength. Most notably, older athletes with

448 shorter BF_{th} fascicles and lower levels of eccentric strength were at an increased risk when
449 compared to younger athletes.

450 As an example, the results of the current study allow us to estimate that a 33 year old athlete with
451 BF_{th} fascicle length of 10cm has a 65% probability of HSI occurring, while a 22 year old has a
452 17% probability of injury. Similarly, 33 year old athletes with two-limb-average eccentric
453 strength level of 200N have an estimated probability of HSI injury of 46% while a 22 year old
454 player has an injury probability of 27%. Despite these results, the Nagelkerke R² coefficient
455 indicated that eccentric strength and BF_{th} fascicle length accounted for approximately 30% of the
456 risk associated with a prospective HSI occurrence. Therefore future research is still needed to
457 identify the other 70% of the risk associated with a prospective HSI that is not accounted for.

458 **Limitations**

459 **Paragraph 30**

460 The authors acknowledge that there are limitations in the current study. Firstly, there is a lack of
461 athlete exposure data and this does not allow for the determination of injury incidence relative to
462 exposure to training and match play. Future work should focus on determining the interaction
463 between high speed running demands and the risk of a future HSI. Secondly, the study was
464 undertaken in elite soccer players and as such generalizing the results to athletes of different
465 sports may be done with caution. For example, in Australian footballers (AFL) the ROC-curve
466 determined threshold for an elevated risk of future HSI was 256N at the start of pre-season⁹. This
467 differs when compared to the 337N found in the current study. One explanation for this variance
468 is the different sporting populations utilised in the two studies that highlights the population
469 specificity of the results. It also indicates that the need for future research in other sporting
470 cohorts is warranted. It should be noted that the thresholds for elevated risk of future HSI

471 determined using the ROC-curve approach should not be compared across studies as an indicator
472 of which cohort possess greater strength. Thirdly, the measures of eccentric knee flexor strength
473 were not made relative to an anterior muscle group such as the knee extensors or the hip flexors.
474 Doing so may have enabled the determination of a hamstring-to-quadriceps ratio, or something
475 of similar nature. Despite the lack of this relative comparison, the eccentric knee flexor strength
476 measures in this study provided valuable information regarding HSI risk, which suggests such
477 ratios may not be crucial.

478 The assessment of muscle fascicle length was only performed on the BF_{lh}. Considering the high
479 rates of BF_{lh} strain injury in the current study, the authors believe it was justified to focus on this
480 muscle. Future research could aim to assess the risk associated with short fascicle lengths in the
481 other hamstring muscles.

482 **Conclusion**

483 **Paragraph 31**

484 Elite soccer players with short BF_{lh} fascicles and low levels of eccentric knee flexor strength are
485 at an increased risk of HSI compared to athletes with longer fascicles and greater eccentric
486 strength. Isometric knee flexor strength and large between-limb imbalances in eccentric strength
487 did not influence the risk of HSI. The interrelationship between the non-modifiable risk factors
488 of increasing age and previous HSI history, with the modifiable variables of eccentric strength
489 and BF_{lh} fascicle length, provides a novel approach to constructing an athlete's risk profile.

490 **CONTRIBUTORS**

491 RT was the principle investigator and was involved with study design, recruitment, analysis and
492 manuscript write up. MB was involved with recruitment, analysis and the manuscript

493 preparation. AS, MW, CL and DO were involved with the study design, analysis and manuscript
494 preparation. All authors had full access to all of the data (including statistical reports and tables)
495 in the study and can take responsibility for the integrity of the data and the accuracy of the data
496 analysis.

497 **TRANSPARENCY DECLARATION**

498 The lead author* (RT) affirms that this manuscript is an honest, accurate, and transparent
499 account of the study being reported; that no important aspects of the study have been omitted;
500 and that any discrepancies from the study as planned (and, if relevant, registered) have been
501 explained. * = The manuscript's guarantor.

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511 party to do any or all of the above.

512 **DATA SHARING**

513 Consent was not obtained for data sharing but the presented data are anonymised and risk of
514 identification is low.

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518 **COMPETING INTERESTS**

519 All authors have completed the Unified Competing Interest form
520 at www.icmje.org/coi_disclosure.pdf (available on request from the corresponding author) and
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527 be relevant to the submitted work; and (5) RT, MB, AS, MW, CL and DO have no financial
528 interests that may be relevant to the submitted work beyond what is already declared.

529 **ETHICAL APPROVAL**

530 This study was approved by the Human Research Ethics Committee of the Australian Catholic
531 University (approval number: 2014 26V) and informed consent was provided to all participants.

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620 Figure 1. The interaction between BF_{lh} fascicle length, history of HSI and the probability of a
621 future HSI (error bars indicate 95% CI).

622 Figure 2. The interaction between BF_{lh} fascicle length, age and the probability of a future HSI.
623 The ages are representative of the 10th, 25th, 50th, 75th and 90th percentile of the cohort. Note that
624 the data has been offset (to the left or right) on the x-axis to allow for the visibility of the error
625 bars of all the age groups. The data points and error bars are reflective of data at 9, 10, 11, 12, 13
626 and 14cm for all groups (error bars indicate 95% CI).

627 Figure 3. The interaction between eccentric knee flexor strength, history of HSI and the
628 probability of a future HSI (error bars indicate 95% CI).

629 Figure 4. The interaction between eccentric knee flexor strength, age and the probability of a
630 future HSI. The ages are representative of the 10th, 25th, 50th, 75th and 90th percentile of the
631 cohort. Note that the data has been offset (to the left or right) on the x-axis to allow for the
632 visibility of the error bars of all the age groups. The data points and error bars are reflective of
633 data at 100, 200, 300, 400 and 500N for all groups (error bars indicate 95% CI).

634 Figure 5. The interaction between eccentric knee flexor strength, BF_{lh} fascicle length and the
635 probability of a future HSI. Note that the data has been offset (to the left or right) on the x-axis to
636 allow for the visibility of the error bars of all the age groups. The data points and error bars are
637 reflective of data at 100, 200, 300, 400 and 500N for all groups (error bars indicate 95% CI).

638

Table 1. Pre-season BF_{lh} architectural characteristics (n=152), eccentric knee flexor strength during the Nordic hamstring exercise (n=131) and MVIC knee flexor strength (n=141) in elite Australian soccer players.

BF _{lh} architecture	Uninjured group		Injured group		Compared to uninjured group average			
	Two-limb average	Between-limb imbalance (%)	Between-limb imbalance (%)	Uninjured limb	Injured limb	Uninjured group vs injured limb (95% CI)	<i>p</i>	Effect size (<i>d</i>)
Passive FL (cm)	11.20 (±1.2) (n=125)	11.2 (±8.2)	13.8(±1.3)	10.90 (±0.9) (n=27)	9.85 (±1.3) ^{##} (n=27)	1.35 (0.8 to 1.8)	0.001**	1.08
25% MVIC FL (cm)	9.53 (±1.2) (n=116)	11.7 (±9.2)	11.3 (±1.0)	9.16 (±1.2) (n=25)	8.51 (±1.0) ^{##} (n=25)	1.02 (0.5 to 1.5)	0.001**	0.92
Passive MT (cm)	2.54 (±0.3) (n=125)	8.0 (±6.1)	7.8 (±6.2)	2.58 (±0.2) (n=27)	2.47 (±0.3) (n=27)	0.07 (-0.1 to 0.2)	0.357	0.23
25% MVIC MT (cm)	2.66 (±0.3) (n=116)	9.8 (±8.0)	6.4 (±5.8)	2.63 (0.3) (n=25)	2.62 (±0.3) (n=25)	0.04 (-0.1 to 0.2)	0.671	0.13
Knee flexor strength measures	Uninjured group		Injured group		Compared to uninjured group average			
	Two-limb average	Between-limb imbalance (%)	Between-limb imbalance (%)	Uninjured limb	Injured limb	Uninjured group vs injured limb (95% CI)	<i>P</i>	Effect size (<i>d</i>)
Eccentric force (N)	309.5 (±73.4) (n=105)			262.6 (±63.2) (n=26)	260.6 (±82.9) (n=26)	48.9 (16.2 to 81.5)	0.004*	0.62
Eccentric torque (Nm)	135.5 (±33.7) (n=105)	10.1 (±8.8)	19.7 (±32.4)	116.2 (±28.7) (n=26)	115.2 (±37.1) (n=26)	20.3 (5.3 to 35.1)	0.008*	0.57
Relative eccentric force (N/Kg)	4.11 (±0.9) (n=105)			3.47 (±0.9) (n=26)	3.46 (±1.2) (n=26)	0.65 (0.2 to 1.1)	0.004*	0.61
Relative eccentric torque (Nm/Kg)	1.79 (±0.4) (n=105)			1.54 (±0.4) (n=26)	1.53 (±0.5) (n=26)	0.26 (0.1 to 0.5)	0.007*	0.57
Isometric force (N)	373.7 (±75.6) (n=116)			365.2 (±73.9) (n=25)	367.9 (±72.7) (n=25)	5.8 (-26.1 to 39.4)	0.690	0.08
Isometric torque (Nm)	163.2 (±34.2) (n=116)	10.4 (±7.56)	12.1 (±13.7)	160.2 (±30.1) (n=25)	161.4 (±34.2) (n=25)	1.8 (-13.1 to 16.7)	0.811	0.05
Relative isometric force (N/Kg)	4.99 (±1.0) (n=116)			4.81 (±1.1) (n=25)	4.81 (±1.1) (n=25)	0.18 (-0.3 to 0.6)	0.428	0.17
Relative isometric torque (Nm/Kg)	2.18 (±0.4) (n=116)			2.10 (±0.4) (n=25)	2.11 (±0.4) (n=25)	0.07 (-0.1 to 0.3)	0.495	0.18

All data represented as mean±SD unless otherwise stated. BF_{lh} = biceps femoris long head, FL = fascicle length, cm = centimetres, SD = standard deviation, 95% CI = 95% confidence interval, MVIC = maximum voluntary isometric contraction, MT = muscle thickness, N = newtons, Nm = newton metres, N/Kg = newtons per kilogram of body weight, Nm/kg = newton metres per kilogram of body weight, **=p<0.01, *=p<0.05 vs average of uninjured group, ##=p<0.01 injured vs uninjured limb in the injured group

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Table 2. Univariate RR to sustain a future HSI using BFlh fascicle length, muscle thickness, eccentric strength, MVIC strength, between-limb imbalances of these variables, previous injury history and demographic data as risk factors.

Risk Factor	<i>n</i>	Percentage from each group that sustained a HSI	RR (95% CI)	<i>p</i>
Passive fascicle length	152			
<10.56 cm	56	33.9	4.1 (1.9-8.7)	0.001**
≥10.56 cm	96	8.3		
Passive fascicle length relative to BFlh length	152			
<0.254	38	39.4	3.7 (1.9-7.3)	0.001**
≥0.254	114	10.5		
25% MVIC fascicle length	141			
<9.61 cm	79	25.3	3.2 (1.2-7.9)	0.008*
≥9.61 cm	62	8.0		
Passive fascicle length imbalance	152			
<10% imbalance	80	16.3	1.2 (0.6-2.4)	0.673
≥10% imbalance	72	19.4		
<15% imbalance	99	15.1	1.5 (0.7-3.0)	0.271
≥15% imbalance	53	22.6		
<20% imbalance	125	16.8	1.3 (0.6-3.0)	0.579
≥20% imbalance	27	22.2		
25% MVIC fascicle length imbalance	141			
<10% imbalance	78	20.0	1.3 (0.6-2.6)	0.512
≥10% imbalance	63	20.6		
<15% imbalance	100	22.7	0.7 (0.3-1.7)	0.630
≥15% imbalance	41	14.6		
<20% imbalance	118	22.0	0.4 (0.1-1.7)	0.249
≥20% imbalance	23	8.7		
Passive muscle thickness	152			
<2.35 cm	36	11.1	0.56 (0.2-1.5)	0.320
≥2.35 cm	116	19.8		
25% MVIC muscle thickness	141			
<2.61 cm	58	20.6	1.3 (0.6-2.7)	0.504
≥2.61 cm	83	15.6		
Eccentric strength	131			
<337 N	96	25.0	4.4 (1.1-17.5)	0.013*
≥337 N	35	5.7		
<145 Nm	89	25.8	3.6 (1.2-11.4)	0.017*
≥145 Nm	42	7.1		
<4.35 N/kg	82	25.6	2.5 (1.1-6.2)	0.041*
≥4.35 N/kg	49	10.0		
<1.86 Nm/kg	78	26.9	2.9 (1.1-7.1)	0.011*
≥1.86 Nm/kg	53	9.4		
Eccentric strength imbalance	131			
<10% imbalance	76	19.7	1.0 (0.5-2.0)	1.000
≥10% imbalance	55	20.0		
<15% imbalance	98	18.3	1.3 (0.6-2.7)	0.459
≥15% imbalance	33	24.2		
<20% imbalance	117	18.8	1.5 (0.6-3.8)	0.476
≥20% imbalance	14	28.5		
MVIC strength	141			
<400 N	93	21.5	2.0 (0.8-5.2)	0.161
≥400 N	48	10.4		
<172 Nm	88	20.4	1.5 (0.7-3.5)	0.364
≥172 Nm	53	13.2		
<4.60 N/kg	52	23.1	1.5 (0.7-3.2)	0.254
≥4.60 N/kg	89	14.6		

<2.07 Nm/kg	62	22.6	1.6 (0.8-3.3)	0.192
≥2.07 Nm/kg	79	13.9		
MVIC strength imbalance	141			
<10% imbalance	81	19.7	0.8 (0.4-1.8)	0.826
≥10% imbalance	60	16.6		
<15% imbalance	110	16.3	1.3 (0.6-2.9)	0.434
≥15% imbalance	31	22.6		
<20% imbalance	126	17.4	1.1 (0.4-3.3)	0.732
≥20% imbalance	15	20.0		
Prior injury	152			
HSI	30	30.0	2.0 (1.0-4.0)	0.063
No HSI	122	14.7		
ACL	16	31.1	1.9 (0.8-4.4)	0.164
No ACL	136	16.1		
Calf strain	13	23.1	1.3 (0.4-3.8)	0.713
No calf strain	139	17.3		
Quadriceps strain	21	28.6	1.8 (0.8-3.9)	0.215
No Quadriceps strain	131	16.0		
Chronic groin pain	13	23.1	1.3 (0.5-3.8)	0.703
No chronic groin pain	139	17.3		
Age (yr)	152			
≤18.0	8	12.5	1.5 (0.2-9.7)	1.000
>18.0	144	18.7		
≤20.4	37	2.7	8.4 (1.1-59.5)	0.005*
>20.4	115	22.6		
≤23.7	74	6.7	4.2 (1.6-10.4)	0.001*
>23.7	78	28.2		
≤28.8	116	13.8	2.2 (1.1-4.3)	0.043*
>28.8	36	30.5		
≤32.6	136	12.5	0.7 (0.2-2.6)	0.739
>32.6	16	18.4		
Height (cm)				
≤182.3	111	15.3	1.6 (0.8-3.4)	0.206
>182.3	41	24.4		
Weight (kg)				
≤77.9	102	15.7	1.4 (0.7-2.8)	0.370
>77.9	50	22.0		

645 RR=relative risk, HSI=hamstring strain injury, BF_{lh}=biceps femoris long head, MVIC=maximal voluntary isometric
646 contraction, 95%CI=95% confidence intervals, cm=centimetres, N=newtons, Nm=newton metres, N/Kg = newtons per
647 kilogram of body weight, Nm/kg = newton metres per kilogram of body weight, ACL=anterior cruciate ligament, yr=years,
648 kg=kilogram, *-p<0.05, **=p<0.001 when comparing the RR of future HSI between groups

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Table 3. Multivariate logistic regression model outputs and receiver operator characteristic curve data using prior HSI, age, BF1h fascicle length and eccentric knee flexor strength.

		Chi Square	<i>p</i>	AUC	Sensitivity	1 – Specificity
Model 1	Whole model	16.54	<0.001*	0.743	0.7778	0.352
	Prior HSI	4.24	0.039*			
	Fascicle length ^a	9.43	0.002*			
	Prior HSI x fascicle length ^a	0.08	0.776			
Model 2	Whole model	23.48	<0.001*	0.777	0.8148	0.328
	Age	3.66	0.055			
	Fascicle length ^a	10.49	0.001*			
	Age x fascicle length ^a	3.46	0.062			
Model 3	Whole model	11.49	0.009*	0.687	0.8077	0.4857
	Prior HSI	2.04	0.152			
	Eccentric strength ^a	6.33	0.011*			
	Prior HSI x eccentric strength ^a	0.03	0.872			
Model 4	Whole model	11.86	0.007*	0.686	0.9615	0.5619
	Age	2.74	0.097			
	Eccentric strength ^a	5.05	0.024*			
	Age x eccentric strength ^a	0.00	0.962			
Model 5	Whole model	17.26	<0.001*	0.759	0.8846	0.3714
	Eccentric strength ^a	4.29	0.038*			
	Fascicle length ^a	7.18	0.007*			
	Eccentric strength ^a x fascicle length ^a	0.08	0.783			

653 ^aDetermined as the average of both left and right limb. AUC, area under the curve. *p<0.05

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