

1 Title:

2 The running and technical performance of U13 to U18 elite Japanese soccer players during
3 match play

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21 **ABSTRACT**

22 The aims of the current study were: 1) to examine age-related differences in match-running
23 performance with two different approaches (speed vs metabolic power) in U13 to U18
24 Japanese elite soccer players; 2) to examine age-related differences in technical match
25 performance in U13 to U18 Japanese elite soccer players. Participants were 110 field players
26 from academies of two professional soccer clubs in Japan. Forty-eight 11-a-side official
27 league matches (13, 6, 9, 7, 6 and 7 matches for U13, U14, U15, U16, U17 and U18 age
28 groups, respectively) were analyzed (152 complete match-files). Global Positioning System
29 (15Hz) and video analysis were employed to analyze running and technical performance
30 during matches, respectively. Total distance covered in absolute terms (U13 < (U14 and U15)
31 < (U16-U18), $P < 0.05$ for all), high-intensity running distance ((U13-U15) < (U16-U18), $P <$
32 0.05 for all) and distance covered during the metabolic power zone $\geq 35 \text{ W}\cdot\text{kg}^{-1}$ relative to
33 match playing time ((U13 < U16), (U13-U15) < (U17 and U18), $P < 0.05$ for all), increased
34 with age. The speed zone based approach (high-intensity running distance, $\geq 4.0 \text{ m}\cdot\text{s}^{-1}$)
35 underestimated high-intensity demands compared to the metabolic power zone based
36 approach ($\geq 20 \text{ W}\cdot\text{kg}^{-1}$) by ~33% to ~57% ($P < 0.01$ for all), with the underestimation
37 declining with age ($P < 0.001$). Pass accuracy improved with age from 73% at U13 to 85% at
38 U18 ($P < 0.001$). Therefore, distance covered at high speeds and at high metabolic powers,
39 and pass accuracy increase with age. Moreover, the speed zone based approach
40 underestimates the demands of match play in Japanese elite youth soccer players. The current
41 results could support coaches to develop players, identify talent and produce age-specific
42 training programs.

43

44 Key words:

45 Association football, metabolic power, skills, match analysis, talent identification.

46 INTRODUCTION

47 Match performance in elite youth soccer is dependent on both physical and technical factors
48 (33). Most research in this regard has focused on the physical demands of match-play by
49 examining elite youth players' match-running performance (2,7,9,16,27,30). Such research
50 has tended to use Global Positioning Systems (GPS) to measure total distance covered by
51 players, and distances covered by players within certain speed zones. The studies have
52 established that elite youth soccer players (10 to 18 years old) cover between 4500 and 7000
53 $\text{m}\cdot\text{h}^{-1}$ in a 60-90 min match with ~3 to ~30% of this distance being covered at high speeds (\geq
54 $4.2 \text{ m}\cdot\text{s}^{-1}$) (2,7,9,16,30). However, the majority of studies examining match-running
55 performance in elite youth soccer have been conducted in Australia (12), Brazil (27),
56 Denmark (32), England (16,30), Italy (8,9), New Zealand (2) and Qatar (7). Conversely, there
57 is a dearth of match-running performance data on elite youth players from eastern Asia. In
58 senior professionals, previous research has shown differences between national leagues in
59 match-running performance (11), and thus, whether the findings from South American and
60 European elite youth players extend to elite youth eastern Asian players remains unclear.
61 Since soccer is one of the most popular sport in the world, contextual match-running data are
62 required to support coaches, sports scientists and players in this region.

63

64 Match-running performance has conventionally been assessed using a speed-zone based
65 approach whereby the distance covered by players within certain speed thresholds is
66 measured (2,7,9,16,30). However, in recent years, researchers have estimated players'
67 metabolic power as an alternative estimate of the physical demands of match-play in
68 professional soccer players (25). Metabolic power is based on an assumption that
69 accelerated/decelerated running on a horizontal level is energetically equivalent to

70 uphill/downhill running at a constant speed on an 'equivalent' slope and is calculated by
71 multiplying estimated energy cost of accelerated/decelerated running and running speed on a
72 horizontal level (25). As energy costs are independent of the velocity and the energetics of
73 uphill/downhill running can be estimated, an estimation of the energy costs of
74 accelerated/decelerated running on a horizontal level can be obtained (25). Unlike the speed
75 zone based approach, estimations of metabolic power account for the accelerations and
76 decelerations made by players during match-play (25). Indeed, even running at low speeds, a
77 high metabolic load may be imposed on soccer players if accelerations and decelerations are
78 elevated.

79

80 Previous studies have examined the validity of GPS for estimating energy expenditure during
81 field-sport locomotor movements (5,6,26). These studies reported that GPS-derived
82 parameters underestimated energy expenditure by ~5% to ~45% depending on the
83 movements compared to direct measurement of oxygen consumption using a portable gas
84 analyzer (5,6,26). However, using GPS systems during match-play is more practical and
85 feasible than using portable gas analyzers. When GPS-derived parameters are considered, the
86 metabolic power zone based approach attempts to account for the energy demands of
87 accelerations and decelerations, and is more closely related to energy expenditure than the
88 speed zone based approach, and is thus potentially a more appropriate method to describe
89 match-play demands in soccer (19).

90

91 The high-intensity demands of training and small-sided games have been assessed using
92 speed zone based and metabolic power zone based approaches in professional soccer players
93 (14,15). In these studies, high-intensity demands estimated via the speed zone based approach
94 was considered to be distance covered at $\geq 4.0 \text{ m}\cdot\text{s}^{-1}$ and high-intensity demands estimated via

95 the metabolic power zone based approach was considered to be distance covered at ≥ 20
96 $W \cdot kg^{-1}$. This was because $20 W \cdot kg^{-1}$ is the metabolic power when running at a constant speed
97 of approximately $4.0 m \cdot s^{-1}$ on natural (25) and artificial (29) grass surfaces. Results
98 demonstrated that the high-intensity demands of soccer were underestimated when applying
99 the fixed speed zone based approach compared to applying the estimated metabolic power
100 zone based approach. The underestimation was approximately 30-40% during training (14)
101 and 45-350% during various small-sided games (15). In addition, such underestimation was
102 ~45% during a professional soccer match (25). Whether the differences between the speed
103 zone based and metabolic power zone based approaches in estimating match-running
104 performance extends to elite youth soccer is yet to be investigated. Such data may provide
105 coaches and sport scientists with a more realistic reflection of the demands of match play
106 (15).

107
108 The physical attributes required for success in soccer are insufficient unless supplemented by
109 an adequate grounding in the skills of the game (33). Whereas, the match-running
110 performance of youth soccer players across a wide age range has been studied in recent years
111 (16,30), technical match performance has only been reported in a limited number of age
112 groups (35,36) or limited technical performance measures (22,36). Previous studies have
113 reported that elite under-17 (U17) players perform a greater number of passes (~38 to ~45
114 passes) and demonstrate a better pass accuracy (77-82%) (35) during a match compared to
115 elite U14 players (~31 passes and a pass accuracy of 72 %, respectively) (36) Whether such
116 age-related differences in technical match performance of youth soccer players extend across
117 a wider age range, remains unclear. An investigation examining both physical and technical
118 aspects of match-play across a wide age range of youth soccer players is needed to provide a
119 holistic understanding of match performance and its development in youth soccer.

120

121 To the authors' knowledge, there are no match-running and technical performance data
122 regarding youth soccer players from Eastern Asia, no match-running performance data
123 estimated using the metabolic power zone based approach in youth soccer, and limited match
124 technical performance related studies in youth soccer players. The availability of such
125 information could support coaches and sports scientists in developing players, identifying
126 talent, and creating age-specific training programs. Therefore, the aims of the current study
127 were: 1) to examine age-related differences in match-running performance using two
128 different approaches (speed and metabolic power zone based approaches) in U13 to U18
129 Japanese elite soccer players; 2) to examine age-related differences in technical match
130 performance in U13 to U18 Japanese elite soccer players.

131

132 **METHODS**

133 **Experimental Approach to the Problem**

134 Players (U13, U14, U15, U16, U17 and U18 age groups) were recruited from academies of
135 two professional soccer clubs in Japan which represents the highest **standard of youth soccer**
136 **development** in Japan. The running and technical performance during match play of these
137 players were assessed across a playing season. This allowed age-related differences in the
138 running and technical match performance of Japanese elite youth soccer players to be
139 elucidated, which in turn, may support player development and talent identification at this
140 level and provides the first norms for Japanese elite youth soccer players, allowing
141 comparative data for other studies interested in this under-explored population.

142

143 To analyze match running performance in more detail, distance covered in particular speed
144 zones and metabolic power zones was assessed using GPS (15Hz (5 Hz interpolated to 15
145 Hz), SPI HPU, GPSports, Canberra, Australia). This allowed the differences in match
146 running performance between the two approaches in elite youth soccer players to be
147 examined. Moreover, 11 variables were selected as technical performance measures; three
148 related to defending, seven related to attacking, and one related to total involvement with the
149 ball.

150

151 **Subjects**

152 The participants were 110 outfield players (**age range = 12.2 to 18.7 years**) who belonged to
153 academies of two professional soccer clubs in Japan (see **table 1** for mean age of each age
154 group). There was one Japanese international player in the U13 and U16 age groups **and two**
155 **Japanese** international players in the U15, U17 and U18 age groups. In each week during the

156 season, the U13, U14 and U15 age groups generally participated in four 2-hour training
157 sessions and a match, and the U16, U17 and U18 age groups generally had five 2-hour
158 training sessions and a match. Players were provided with a written and verbal explanation of
159 the study including all measurements to be taken. Each player signed an informed assent
160 form and completed a health screen questionnaire prior to participation in the study. Each
161 player's parent, guardian or care-giver signed a consent form prior to the start of the study.
162 Players were free to withdraw from the study without giving any reasons and without any
163 penalty regarding their academy position and this was explained to them verbally and in
164 writing. Participants were withdrawn from the study if they did not have a satisfactory health
165 status. The study was approved by a University Ethics Committee.

166

167 **Match analysis**

168 Match analysis was conducted on official league matches. All matches were played on
169 international match size (length = 100-110 m, width = 64-75 m, Fédération Internationale de
170 Football Association (FIFA)) flat artificial grass pitches (third generation astroturf). A total of
171 48 11-a-side matches were analyzed and 152 complete match-files were obtained (1-5 match-
172 files per player, see table 1 for number of matches and match-files in each age group). Match
173 duration was 60, 70, 80 and 90 min for U13, U14, U15 and U16-U18 age groups,
174 respectively. To be included in the analysis, players were required to play a full match, play
175 the same position throughout the match, and play in a 4-4-2 formation. This was because
176 playing formation (3,31) and playing position (7,21,35) influence physical and technical
177 performance. Playing position distribution was 41% central defenders, 14% wide defenders,
178 23% central midfielders, 5% wide midfielders and 18% strikers in all age groups. All match
179 files were obtained from the teams who finished in the top half of the league except 18-45%
180 of match files from the U16, U17 and U18 age groups (all teams finished in 8th out of 10

181 teams). In each age group, final league position of opposition teams was fairly evenly spread
182 from the top to bottom and 55-77% and 29-57% of match-files were from home matches and
183 matches won, respectively.

184 -----Table 1 here-----

185

186 **Match-running performance**

187 The match-running performance of each player was analyzed with the assessment of
188 distances covered at different speed zones (35) and distances covered at different metabolic
189 power zones (23,25) (see table 2). Metabolic power was estimated by the previously reported
190 equation and energy cost of running at constant speed was assumed as $3.6 \text{ J}\cdot\text{kg}^{-1}\cdot\text{m}^{-1}$ (25).

191

192 Metabolic power = $EC \cdot v$

193

194 Where, EC is the energy cost of accelerated running on grass ($\text{J}\cdot\text{kg}^{-1}\cdot\text{m}^{-1}$) = $(155.4\cdot\text{ES}^5 -$
195 $30.4\cdot\text{ES}^4 - 43.3\cdot\text{ES}^3 + 46.3\cdot\text{ES}^2 + 19.5\cdot\text{ES} + 3.6)\cdot\text{EM}\cdot\text{KT}$, ES = the equivalent slope = $\tan(90$
196 $- \arctan g/a_f)$, g = Earth's acceleration of gravity; a_f = forward acceleration; EM = the
197 equivalent body mass = $[(a_f^2\cdot g^{-2}) + 1]^{0.5}$, KT = a constant = 1.29, v = running speed ($\text{m}\cdot\text{s}^{-1}$).

198 The distances were expressed in absolute (meters per match) and relative (meters per hour of
199 match playing time) terms.

200

201 Match running performance was analyzed with 15 Hz (5 Hz interpolated to 15 Hz) GPS
202 technology (SPI HPU, GPSports, Canberra, Australia) which was positioned on the upper
203 back in a custom-made vest. This device has been reported to possess an accuracy of greater
204 than 99% when 8 laps of 165 m team sport simulation circuit with various movement speeds
205 (walking to sprinting and fast deceleration) and change of directions at different angles

206 (figure eight agility run and 90 degrees turning) was performed (18). Moreover, maximal
207 speed during 10, 20 and 30 m sprints showed less than a 5% difference compared to the
208 values measured by photoelectric timing gates (18). Inter-unit reliability (typical error
209 expressed as coefficient of variation (CV)) for total distance covered, distance covered at <
210 $3.9 \text{ m}\cdot\text{s}^{-1}$, $3.9\text{-}5.6 \text{ m}\cdot\text{s}^{-1}$ and $>5.6 \text{ m}\cdot\text{s}^{-1}$ were 1.9, 2.0, 7.6 and 12.1%, respectively (18).

211

212 The validity and reliability of GPS for measuring accelerations and decelerations has been
213 previously assessed with a 50 Hz Laveg laser (34). Validity (typical error (CV)) of
214 accelerations and decelerations were 3.6-5.9% and 11.3%, respectively, and reliability
215 (typical error (CV)) of accelerations and decelerations were 1.9-4.3% and 6.0%, respectively
216 (34). Furthermore, validity of GPS for determining metabolic power has been examined using
217 32 Hz radar system (28). The study employed 70 m (35 + 35 m) of self-paced intermittent
218 running involving walking, jogging, accelerations and decelerations during running and 70 m
219 (35 + 35 m) of self-paced running (35 m) and sprinting (35 m) (28). The typical error (CV) of
220 mean metabolic power, time spent at high metabolic power ($> 20 \text{ W}\cdot\text{kg}^{-1}$) and time spent at
221 very high metabolic power ($> 25 \text{ W}\cdot\text{kg}^{-1}$) were 2.4%, 4.5% and 6.2%, respectively (28).

222

223 In the current study, the same GPS unit could not always be worn by a player in different
224 matches due to logistical issues. At least 8 satellites (mean \pm SD = 9.7 ± 0.9 satellites) were
225 connected during data collection which is the minimum number of satellites required to allow
226 an accurate measurement (34,37) and mean horizontal dilution of position was 1.2 ± 0.4 . The
227 distances covered in speed and metabolic power zones were calculated using Team AMS
228 software version R1.2016.4 (GPSports, Canberra, Australia).

229 -----Table 2 here-----

230

231 **Technical match performance**

232 Matches were recorded using a video camera (HC-V360M, Panasonic, Osaka, Japan)
233 positioned 5 m away from the halfway line and 3 m above the ground level. Videos were
234 transferred to PC and on-the-ball actions of each player were manually notated. The technical
235 variables and associated operational definitions (Matchinsight, Prozone Sports Ltd[®], Leeds,
236 UK) are presented in **table 3**. To calculate the technical performance variables in relative
237 terms, attacking and defending variables were adjusted for the team's ball possession
238 duration and opposition's ball possession duration, respectively. This is because the ball
239 possession time varies between the matches and the players can only perform attacking
240 technical measures when the team is in possession of the ball and defensive technical
241 measures when the opposition is in possession of the ball **(20)**. All variables were expressed
242 in absolute (per match) and relative (per hour of team's/opposition's ball possession time)
243 terms.

244

245 All matches were analyzed by one analyst who possessed UEFA (Union of European
246 Football Associations) "B" coaching license. The analyst had analyzed more than 20 matches
247 prior to the analysis of the current data. The analyst independently coded the same randomly
248 selected match twice with 6 months apart to assess intra-observer reliability. Cohen's Kappa
249 was employed to examine the strength of agreement between observations on the technical
250 performance variables. Overall, intra-observer reliability was very good ($\kappa = 0.88, p < 0.05$).
251 Moreover, there was a very good agreement between observations for headers/shots ($\kappa =$
252 $1.00, p < 0.05$), successful passes ($\kappa = 0.92, p < 0.05$), crosses/dribbles ($\kappa = 0.89, p < 0.05$),
253 passes/touches ($\kappa = 0.88, p < 0.05$), clearances ($\kappa = 0.82, p < 0.05$), and good agreement for
254 tackles ($\kappa = 0.78, p < 0.05$) and blocks ($\kappa = 0.76, p < 0.05$) **(1)**.

255 -----Table 3 here-----

256

257 **Statistical analyses**

258 Data were not normally distributed as examined by Kolmogorov-Smirnov tests. Spearman's
259 rank correlations (r_s) were employed to examine the relationship between age and match
260 performance variables. The magnitude of correlation coefficients was considered as trivial (r_s
261 < 0.1), small ($0.1 \leq r_s < 0.3$), moderate ($0.3 \leq r_s < 0.5$), large ($0.5 \leq r_s < 0.7$), very large ($0.7 \leq$
262 $r_s < 0.9$) nearly perfect ($0.9 \leq r_s < 1.0$), and perfect ($r_s = 1.0$) (17).

263

264 Kruskal-Wallis tests were conducted to examine the effect of age-group on match
265 performance variables. Pairwise comparisons with adjusted P-values were performed to
266 assess differences (13). To examine differences between speed and metabolic power zone
267 based approaches in estimating high-intensity demands during match-play, a Mann-Whitney
268 U test was performed to compare high-intensity running and $MP \geq 20$ distances.

269

270 The effect size (r_{ES}) for the differences were calculated wherever appropriate by dividing z-
271 score by square root N (13) and the values (r_{ES}) were considered as trivial ($r_{ES} < 0.01$), small
272 to medium (0.1 to 0.3), medium to large (0.3 to 0.5) and large to very large ($r_{ES} > 0.5$) (10).

273 The level of statistical significance was set at $p < 0.05$. Results are presented as mean \pm SD
274 and all the statistical analyses were performed using SPSS version 22.0 (IBM SPSS statistics
275 for Windows, IBM, Armonk, New York, USA).

276

277 **RESULTS**

278 **Running performance during match play**

279 Match-running performance of each age group is detailed in table 4. Absolute total distance
280 covered during a match increased with age from 7388 ± 741 m for the U13 age group to
281 11469 ± 921 m for the U18 age group ($P < 0.001$, $r_{ES} = 1.04$). For absolute distance covered
282 in all speed zones and metabolic power zones, there were significant between-age group
283 differences, with older age groups completing greater distances ($P < 0.001$, $r_{ES} = 0.77$ - 1.10).

284

285 When match-running distance was adjusted to match playing time, total distance was similar
286 between all age groups ($\sim 7000 \text{ m}\cdot\text{h}^{-1}$). For distance covered in particular speed zones,
287 walking (~ 2200 to $\sim 2400 \text{ m}\cdot\text{h}^{-1}$), jogging (~ 900 to $\sim 1100 \text{ m}\cdot\text{h}^{-1}$) and running (~ 900 to ~ 1100
288 $\text{m}\cdot\text{h}^{-1}$) distances were not different between the age groups. Distance covered by high-speed
289 running, sprinting, high-intensity running and very high-intensity running increased with age
290 from the U13 to U17 age group (at least $P < 0.05$, $r_{ES} = 0.41$ - 0.74) (figure 1). There was a
291 positive relationship between age and distance covered by high-speed running ($r_s = 0.54$),
292 sprinting ($r_s = 0.58$), high-intensity running ($r_s = 0.34$) and very high-intensity running ($r_s =$
293 0.56) ($P < 0.001$ for all).

294

295 For the metabolic power zone based approach, distance covered per hour of match-play by
296 the U13 to U18 age groups in LP, MedP, HP and $MP \geq 20$ were ~ 2700 to $\sim 2900 \text{ m}\cdot\text{h}^{-1}$, ~ 2300
297 to $\sim 2700 \text{ m}\cdot\text{h}^{-1}$, ~ 1200 to $\sim 1400 \text{ m}\cdot\text{h}^{-1}$ and ~ 1700 to $\sim 2000 \text{ m}\cdot\text{h}^{-1}$, respectively and there were
298 no between-age group differences. Distance covered in EP, MaxP and $MP \geq 35$ increased with
299 age from the U13 to U17 age group (at least $P < 0.01$ for all, $r_{ES} = 0.49$ - 0.78) (figure 2).

300 There was a positive relationship between age and distance covered in EP ($r_s = 0.38$), MaxP
301 ($r_s = 0.61$) and MP \geq 35 ($r_s = 0.50$) ($P < 0.001$ for all).

302 -----Table 4 and figure 1&2 here-----

303

304 **Comparison of high-intensity running distance and distance covered in MP \geq 20**

305 High-intensity running distance was ~600 to ~800 m shorter than distance covered in MP \geq 20
306 in all age groups ($P < 0.01$ for all, $r_{ES} = 0.49-0.61$). The percentage difference (%) between
307 high-intensity running and MP \geq 20 distances declined with age from $56.9 \pm 25.5\%$ for the
308 U13 age group to $30.4 \pm 10.6\%$ for the U17 age group ($P < 0.001$, $r_{ES} = 0.63$) (figure 3) and
309 there was a negative relationship between age and percentage difference ($r_s = -0.45$, $P <$
310 0.001).

311 -----Figure 3 here-----

312

313 **Technical performance during match play**

314 For absolute technical match performance, the number of passes, touches and involvements
315 with the ball increased with age from the U13 to U18 age group ($P < 0.001$, $r_{ES} = 0.40-0.55$).
316 Moreover, pass accuracy gradually improved with age by 12% from the U13 to U18 age
317 group ($P < 0.001$, $r_{ES} = 0.58$) and there was a positive relationship between age and pass
318 accuracy ($r_s = 0.33$, $P < 0.01$) (figure 4). No apparent trends were observed in the rest of
319 technical performance variables.

320

321 There were no between-age group differences in team and opposition possession time (%)
322 (table 4). When technical performance was adjusted for possession times, no between-age
323 group differences were observed in all technical performance variables (table 5).

324

-----Table 4&5 and figure 4 here-----

325

326 DISCUSSION

327 The current study is the first to examine the development of match-running performance,
328 using speed and metabolic power zone based approaches, and technical match performance in
329 U13 to U18 elite Japanese soccer players. The main findings of the present study were that:
330 both absolute and relative distance covered at high speeds (sprinting: $> 7.0 \text{ m}\cdot\text{s}^{-1}$ and very
331 high-intensity running: $\geq 5.5 \text{ m}\cdot\text{s}^{-1}$) and metabolic power (MaxP: $> 55 \text{ W}\cdot\text{kg}^{-1}$ and MP ≥ 35 : \geq
332 $35 \text{ W}\cdot\text{kg}^{-1}$) increased similarly with age; high-intensity demands were underestimated by the
333 speed zone based approach ($\geq 4.0 \text{ m}\cdot\text{s}^{-1}$) compared to the metabolic power zone based
334 approach ($\geq 20 \text{ W}\cdot\text{kg}^{-1}$) in all age groups; the underestimation of high-intensity demands
335 reduced with age; and finally, pass accuracy improved with age.

336

337 Total distance and distances covered at various speed zones during match-play increased with
338 age. This is the first study to examine the development of match-running performance in elite
339 youth soccer players from Japan. The current results are in-line with previous research into
340 elite youth soccer players from Europe and western Asia that show similar age-related
341 improvements in match-running performance (7,16). This is also the first study to provide
342 data regarding the development of match-running distance using the metabolic power zone
343 based approach in elite youth soccer. When match-running distance was calculated using the
344 metabolic power zone based approach, the pattern of increases in distance covered with age
345 was similar to the speed zone based approach data. However, when the distances were
346 adjusted for match playing time, between-age group differences were less evident in total
347 distance, distance covered at lower speeds (walking to running), and distance covered at
348 lower metabolic powers (LP to HP), which is in line with previous studies (7,12,16).

349 Conversely, when adjusted for playing time, distances covered within high speed and
350 metabolic power zones still demonstrated improvements with age and improvements were

351 more apparent in higher speed and metabolic power zones (i.e., sprinting, very high-intensity
352 running, MaxP and $MP \geq 35$). The age-related differences in speed zone distances are similar
353 to the previous studies on elite youth soccer players from England (16) and Qatar (7).
354 Therefore, speed and metabolic power zone based approaches show similar improvements in
355 match-running distance with age in both absolute and relative terms. Further, both approaches
356 demonstrate the importance of distance covered at high intensity, which supports previous
357 research showing that the distance covered at high speeds differentiate age groups in elite
358 youth players (16) and the standard of play in professional senior soccer players (24).
359
360 In the current study, high-intensity demands of soccer matches were underestimated by 33 to
361 57% in the U13 to U18 elite youth soccer players when match-running distance was
362 calculated using a speed zone based approach ($\geq 4.0 \text{ m}\cdot\text{s}^{-1}$) compared to a metabolic power
363 zone based approach ($\geq 20 \text{ W}\cdot\text{kg}^{-1}$). Similar underestimations (~ 45 to $\sim 72\%$) have been
364 reported from professional soccer players during 10 vs 10 small-sided-games (14) and match
365 play (25). The underestimation of high-intensity demands declined with age from 57% in the
366 U13 to 33% in the U17 age group. A possible explanation for this age-related variation in the
367 underestimation of high-intensity running is that although high-intensity running distance (\geq
368 $4.0 \text{ m}\cdot\text{s}^{-1}$) increased with age, younger players are possibly producing a greater amount of
369 high-intensity activities (i.e. acceleration and decelerations) at low speeds compared to older
370 counterparts since running distance at high speeds in younger age groups were less than older
371 age groups. Hence, it is important for coaches and sports scientists to know that the
372 conventional speed zone based approach underestimates match demands of elite youth soccer
373 players and such underestimation is greater in younger players.

374

375 To our knowledge, this study is the first to investigate differences in technical performance
376 between six consecutive age groups (U13 to U18) in Japanese elite youth soccer players. The
377 results demonstrated that pass accuracy improved with age from 73% for the U13 age group
378 to 85% for the U18 age group and similar values have been demonstrated by U14 elite and
379 sub-elite (36) and U17 elite players (35). Previous research has shown that pass accuracy was
380 greater for teams with higher than lower ranking in an U17 international tournament (35) and
381 was greater for the top three (82%) than the bottom three (75%) teams in the first division of
382 Spanish professional soccer league (21). This suggests that pass accuracy distinguishes
383 standard of play in professional and youth soccer players. The current study supports and
384 extends previous work by showing that pass accuracy improves with age in elite youth soccer
385 players, suggesting that it is an important technical performance measure for coaches to focus
386 on during the process of player development and talent identification.

387

388 Moreover, the number of passes, touches, and involvements with the ball during a match
389 increased with age in the U13 to U18 elite youth soccer players. However, the between-age
390 group differences disappeared when these technical performance variables were adjusted for
391 ball possession time. Nevertheless, the number of tackles, crosses, passes and shots in the
392 current sample were similar to that of the U17 soccer players who were competing in the top
393 division league of various countries (35). This suggests that the technical performance of elite
394 youth Japanese soccer players is similar to that of elite youth soccer players from other
395 countries. It is possible that at this high standard of play, the technical profiles seen in the
396 current study (and previous research), are minimum requirements for performance in elite
397 youth soccer, but that more sensitive measures of technical performance are possibly required
398 to differentiate subgroups within this homogenous population. Future research may consider

399 assessing factors such as success rates, passing distribution distance, location on the pitch etc.
400 (3).

401

402 There were some potential limitations of the current study. Firstly, the team and opposition
403 quality (4,21,35), match location (4,21) and match outcome (4,21) have been shown to
404 influence physical and technical performance, and these factors were not considered in the
405 current study. However, given that the team and opposition ball possession times are
406 influenced by team and opposition strengths (4), no between-age group differences in the
407 team and opposition ball possession times were observed in the current study. Moreover, the
408 final league position of most teams was in the top half, and the final league position of
409 opposition teams that each age group faced, was fairly evenly spread from the top to bottom.
410 Hence, the team and opposition strength were possibly similar across the age groups. In
411 addition, similar match location and outcome distributions were observed in each age group
412 (55-77% and 29-57% of match-files in each age group were from home matches and matches
413 won, respectively) that the influence of match location and outcome may be insignificant.

414

415 **PRACTICAL APPLICATIONS**

416 The current study highlights a similar trend in age-related improvements of match-running
417 distance at high-speeds and at high metabolic powers in U13 to U18 elite Japanese soccer
418 players. However, the speed zone based approach ($\geq 4.0 \text{ m}\cdot\text{s}^{-1}$) underestimates high-intensity
419 demands of soccer matches compared to metabolic power zone based approach ($\geq 20 \text{ W}\cdot\text{kg}^{-1}$)
420 and a greater underestimation was observed in the younger age groups which suggests that
421 younger players produce a large proportion of high-intensity activities (accelerations and
422 decelerations) at low speeds. Moreover, an improvement in pass accuracy with age was
423 revealed. Therefore, coaches and sports scientists are recommended to carefully consider
424 distance covered by high-speed and high metabolic power during match play especially when
425 they compare match-running performance of players from different age groups. Moreover, an
426 employment of metabolic power zone based approach rather than speed zone based approach
427 is advised to estimate high-intensity demands of match play in youth soccer players and the
428 current results would support coaches and sports scientists to produce age-specific training
429 programs. For technical attributes, it is recommended to focus on pass accuracy when
430 developing players and identifying talent in elite youth players.

431

432

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435

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534

535 **Figure captions**

536 Figure 1. Pass accuracy of the U13 to U18 elite soccer player (%). Significantly different at p
537 < 0.05 vs. a: U13, b: U14, c: U15, d: U16. **P < 0.001.

538

539 Figure 2. Distance covered by running, high-speed running, sprinting, high-intensity running
540 and very high-intensity running in the U13 to U18 elite soccer players relative to match
541 playing time. Significantly different at p < 0.05 vs. a: U13, b: U14. *P < 0.01. **P < 0.001.

542

543 Figure 3. Distance covered by HP (high power), EP (elevated power), MaxP (maximal
544 power), MP \geq 20 ($\geq 20 \text{ W}\cdot\text{kg}^{-1}$) and MP \geq 35 ($\geq 35 \text{ W}\cdot\text{kg}^{-1}$) in the U13 to U18 elite soccer
545 players relative to match playing time. Significantly different at p < 0.05 vs. a: U13, b: U14,
546 c: U15. *P < 0.01. **P < 0.001.

547

548 Figure 4. Percentage differences in high-intensity running and MP \geq 20 distances (%) in the
549 U13 to U18 elite soccer players. Significantly different at p < 0.05 vs. a: U13, b: U14, c: U15.
550 **P < 0.001.

551

Tables

Table 1. Age, number of matches, number of players and complete match files of the U13 to U18 elite youth soccer players

Age group		U13	U14	U15	U16	U17	U18
Age (years)	Mean	13.1	14.0	15.0	15.9	17.1	18.1
	SD	0.4	0.4	0.3	0.5	0.4	0.3
Number of matches		13	6	9	7	6	7
Number of players		30	14	20	16	14	16
Complete match-files (no.)		35	17	25	22	22	31

Table 2. Speed and metabolic power categories

Speed categories (m·s ⁻¹)		Metabolic power categories (W·kg ⁻¹)	
Standing	0.0-0.2	Lower power (LP)	0-10
Walking	0.2-2.0	Medium power (MedP)	10-20
Jogging	2.0-4.0	High power (HP)	20-35
Running	4.0-5.5	Elevated power (EP)	35-55
High speed running	5.5-7.0	Maximal power (MP)	> 55
Sprinting	> 7.0	MP≥20	≥ 20
High intensity running	≥ 4.0	MP≥35	≥ 35
Very high intensity running	≥ 5.5		

Table 3. Technical performance variables and their definitions

Defending variables	
Block:	An opposing player, in close proximity, prevents the ball from reaching its intended target. This can take place anywhere on the pitch.
Clearance:	A defensive touch undertaken by a player under pressure from the opposition or with no intended target.
Tackle:	Dispossession or attempted dispossession of an opponent by physical challenge or pressure when actual challenge/tackle is attempted.
Attacking variables	
Cross:	Any ball played from a wide area into the box with the aim of creating a goal scoring opportunity.
Dribble:	Any run with the ball that involves either multiple touches with a directional change or beating an opponent.
Header:	Any touch of the ball with a player's head except a shot using head.
Pass:	Any attempt by a player to play the ball to a team-mate.
Pass accuracy:	A ratio calculated from successful passes divided by all passes (presented in percentages).
Shot:	Any attempt at goal with any part of the body.
Touch:	Any touch other than a block/clearance/cross/dribble/pass/shot/tackle taken by a player with any part of his body except his head, includes mis-controls of the ball.
Involvement with the ball:	Sum of count values of all attacking and defending variables (except pass accuracy).

Table 4. Physical and technical performances during a match in the U13 to U18 elite youth soccer players (absolute values)

Age group		U13	U14	U15	U16	U17	U18	r _{ES}							
Total playing time (min)	Mean	64.6	76.5	84.2	94.7	95.2	95.1	0.41-1.04							
	SD	4.1	5.7	1.4	0.7	1.9	1.7								
Percentage time team possessed the ball (%)	Mean	34	35	33	32	32	34								
	SD	5	8	3	6	5	7								
Percentage time opponents possessed the ball (%)	Mean	28	29	30	29	28	28								
	SD	5	6	6	7	6	7								
Time ball out of play (%)	Mean	38	36	37	39	40	38								
	SD	8	7	4	4	3	3								
Total distance (m)	Mean	7388	9305 ^a	9846 ^{a**}	11257 ^{a**b*c}	11223 ^{a**b*c}	11469 ^{a**b**c*}								
	SD	741	1271	821	746	954	921								
Speed zone based approach															
Walking (m)	Mean	2569	2789	3343 ^{a**}	3653 ^{a**b**}	3827 ^{a**b**}	3774 ^{a**b**}		0.58-1.02						
	SD	231	425	300	266	332	332								
Jogging (m)	Mean	3584	483 ^{a*}	4782 ^{a**}	5210 ^{a**}	4966 ^{a**}	5325 ^{a**}			0.54-0.89					
	SD	642	1085	696	685	748	642								
Running (m)	Mean	995	1391	1316	1718 ^{a**c}	1743 ^{a**c}	1670 ^{a**c}				0.40-0.77				
	SD	311	490	446	357	416	355								
High-speed running (m)	Mean	190	262	340 ^a	534 ^{a**b*}	561 ^{a**b**c}	569 ^{a**b**c}					0.40-0.84			
	SD	123	143	133	269	193	202								
Sprinting (m)	Mean	14	20	52 ^{a*}	91 ^{a**}	115 ^{a**}	117 ^{a**}	0.45-0.81							
	SD	22	27	41	87	87	90								
High-intensity running (m)	Mean	1199	1673	1707	2343 ^{a**bc}	2418 ^{a**bc*}	2355 ^{a**bc}						0.44-0.87		
	SD	396	536	539	550	574	576								
Very high-intensity running (m)	Mean	204	281	391 ^a	625 ^{a**b*}	675 ^{a**b**c}	686 ^{a**b**c}							0.43-0.86	
	SD	138	159	166	337	260	267								
Metabolic power zone based approach															

LP (m)	Mean	3009	3410	3951 ^{a**b*}	4323 ^{a**b**}	4523 ^{a**b**c*}	4470 ^{a**b**c*}	0.52-1.10
	SD	174	382	219	202	243	271	
MedP (m)	Mean	2572	3477 ^{a*}	3461 ^{a**}	3783 ^{a**}	3582 ^{a**}	3918 ^{a**}	0.54-0.93
	SD	438	817	514	486		499	
HP (m)	Mean	1305	1769 ^a	1706 ^a	2088 ^{a**c}	2014 ^{a**}	1996 ^{a**}	0.40-0.83
	SD	343	518	406	346		373	
EP (m)	Mean	411	525	563	790 ^{a**b*c}	806 ^{a**b*c*}	782 ^{a**b*c*}	0.50-0.92
	SD	118	135	139	199		161	
MaxP (m)	Mean	91	123	165 ^a	267 ^{a**b*}	297 ^{a**b**c*}	302 ^{a**b**c*}	0.40-0.91
	SD	67	58	58	120		118	
MP≥20 (m)	Mean	1806	2417	2433 ^a	3144 ^{a**bc*}	3118 ^{a**c}	3080 ^{a**c}	0.41-0.90
	SD	429	603	512	516	622	538	
MP≥35 (m)	Mean	501	648	728 ^a	105 ^{a**b*c}	1104 ^{a**b**c*}	1084 ^{a**b**c*}	0.38-0.93
	SD	177	184	174	306	243	253	

Technical performance

Block (no.)	Mean	1	1	2	2	1	1	
	SD	1	1	2	1	1	1	
Clearance (no.)	Mean	2	2	3	4	5	3	
	SD	2	2	2	3	3	3	
Tackle (no.)	Mean	3	3	3	6 ^{ac}	4	4	0.41-0.46
	SD	3	3	3	4	3	3	
Cross (no.)	Mean	1	1	1	1	1	1	
	SD	1	2	1	2	2	2	
Dribble (no.)	Mean	11	13	14	13	9	11	
	SD	7	8	6	9	8	10	
Header (no.)	Mean	5	4	5	6	8 ^{ab*}	7	0.39-0.56
	SD	3	2	3	3	4	5	
Pass (no.)	Mean	29	37	38	37	43 ^a	50 ^{a**}	0.40-0.51

	SD	12	17	13	13	17	23	
Shot (no.)	Mean	1	1	1	1	1	1	
	SD	2	1	2	1	1	1	
Touch (no.)	Mean	14	20	18	21	28 ^{a*}	32 ^{a**}	0.51-0.54
	SD	6	8	6	9	17	20	
Involvement with the ball (no.)	Mean	68	82	85	90	100 ^{a*}	110 ^{a**}	0.47-0.55
	SD	23	32	21	26	35	45	

LP = low power (0-10 W·kg⁻¹); MedP = medium power (10-20 W·kg⁻¹), HP = high power (20-35 W·kg⁻¹); EP = elevated power (35-55 W·kg⁻¹); MaxP = maximal power (> 55 W·kg⁻¹); MP_{≥20} (≥ 20 W·kg⁻¹); MP_{≥35} (≥ 35 W·kg⁻¹). Significantly different at p < 0.05 vs. a: U13, b: U14, c: U15, d: U16. *P < 0.01. **P < 0.001.

Table 5. Technical performance of the U13 to U18 elite youth soccer players (adjusted to possession time)

Age group		U13	U14	U15	U16	U17	U18
Block (no.)	Mean	4	4	4	3	3	3
	SD	5	3	4	3	3	4
Clearance (no.)	Mean	8	7	7	10	11	7
	SD	7	6	6	8	8	6
Tackle (no.)	Mean	11	9	7	14	9	9
	SD	10	7	6	10	8	7
Cross (no.)	Mean	2	2	2	2	2	3
	SD	2	3	3	3	3	4
Dribble (no.)	Mean	29	30	30	23	17	18
	SD	16	19	13	15	15	14
Header (no.)	Mean	13	9	11	13	16	14
	SD	9	5	8	7	9	11
Pass (no.)	Mean	78	83	82	72	84	88
	SD	25	36	29	19	31	31
Shot (no.)	Mean	4	2	3	2	1	2
	SD	5	2	4	2	2	3
Touch (no.)	Mean	38	44	40	40	54	57
	SD	14	14	13	18	32	35
Involvement with the ball (no.)	Mean	187	189	186	179	198	201
	SD	48	67	49	40	64	68

