A CODING SYSTEM TO QUANTIFY POWERFUL ACTIONS IN SOCCER MATCH PLAY: A PILOT STUDY

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Keywords: Locomotion, pediatric exercise, movement components, biomechanics.

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Abstract

3 Purpose: The powerful activity profile of elite soccer match play has not been 4 documented appropriately to inform specific maximal power assessment and 5 development criteria. The aims of the current study were to develop a soccer specific 6 powerful action (SSPA) notational analysis coding system that could be used to 7 compare frequency and durations of powerful actions during elite youth soccer match 8 play. Methods: Sixteen elite male English Premier League (EPL) Academy players 9 $(19\pm1 \text{ yrs})$ were recorded by an individual camera during sixteen competitive EPL U18 10 and U21 games. Video footage was analyzed using performance analysis software and 11 SSPAs were coded according to the following categories: initial acceleration, leading 12 acceleration, sprint, unilateral jump and bilateral jump. Results: The SSPA coding 13 system demonstrated very good inter- and intra-rater objectivity (kappa coefficients 14 ≥ 0.827). Elite youth EPL soccer players undertook significantly more initial (31±9) and 15 leading (37±12) accelerations than sprints (8±3; p=0.014, d=1.7, and p<0.001, d=1.7, 16 respectively) and jumps (6±5; p=0.002, d=1.7 and p<0.001, d=1.7, respectively). 17 Players performed a significantly greater number of initial and leading accelerations 18 with action durations below 1.5s compared to above 1.5s (p=0.001, d=1.6, and p=0.002, 19 d=1.4), respectively. Conclusions: Our SSPA coding system provides an objective 20 observational instrument for quantifying the frequency and duration of powerful 21 actions performed during elite soccer match play. In our sample of elite youth soccer 22 players, horizontal accelerations of short duration (<1.5s) from different starting speeds 23 appear the most dominant powerful action in elite youth soccer match play.

25 Keywords: Locomotion, pediatric exercise, movement components,
26 biomechanics.

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28 An analysis of movement is important for understanding the physiological 29 demands of a sport (Carling, Bloomfield, Nelsen, & Reilly, 2008). Evaluating the 30 specific movements provides the basis for categorizing the types of actions that may be 31 important for performance. Sport specific actions can be described as powerful when 32 the athlete attempts to generate the greatest possible velocity at take-off, release or 33 impact (Cormie, McGuigan, & Newton, 2011). Understanding the specific nature of 34 the powerful actions performed during elite soccer match play can help inform 35 assessments of muscular power and training strategies in this domain (Issurin, 2013; 36 Maulder & Cronin, 2005).

37 Much of the available data on the performance of powerful actions within soccer 38 come from studies that have used automated time motion analysis systems, which have 39 classified maximal accelerations (Bradley, Di Mascio, Peart, Olsen, & Sheldon, 2010; 40 Varley & Aughey, 2013) and sprint (Di Salvo et al., 2010) efforts as actions that require 41 the player to complete both accelerations and running velocities over pre-determined thresholds [i.e. maximal acceleration threshold: $>2.78 \text{ m.s}^{-2}$ (Varley & Aughey, 2013); 42 43 Sprint threshold: >25.2 km.hr⁻¹ (Di Salvo et al., 2010)]. However, during linear speed 44 testing protocols (Stolen, Chamari, Castagna, & Wisloff, 2005) and competitive games 45 (Bradley et al., 2009), elite soccer players present a range of individual capabilities in 46 terms of accelerations and maximal running speeds. As a consequence, the 47 classification of accelerations and sprints as maximal could be misleading as these 48 arbitrary speed thresholds may incorrectly classify movements that are not truly 49 indicative of a maximal action for a specific individual player (Dogramac, Watsford, &

50 Murphy, 2011). The accuracy and objectivity of time motion analyses systems are 51 frequently compromised at such higher speed ranges, and in actions that require both 52 greater rates of acceleration and during efforts involving a change of direction 53 (Akenhead, French, Thompson, & Hayes, 2014; Jennings, Cormack, Coutts, Boyd, & 54 Aughey, 2010). Automated time motion analyses systems also often fail to report the 55 vertical jump demands of soccer. Subsequently, considering these limitations, studies 56 using automated time motion analysis systems may not characterize the powerful 57 activity in elite soccer match play in sufficient detail to inform the specificity of soccer-58 associated muscular power assessment and development protocols.

59 Notational analysis systems have been proven as reliable and valid method of 60 tracking player movements where short distances, frequent changes in direction 61 (Dogramac et al., 2011) and vertical jumps (Faude, Koch, & Meyer, 2012; Mohr, 62 Krustrup, & Bangsbo, 2003) are observed. Unlike automated time motion analyses 63 systems, this method offers more flexibility for the identification of powerful actions 64 based on the circumstances, during which the action is performed (i.e. during a situation 65 when two players from opposite teams are accelerating in a race to get to an area of the 66 pitch, or to a free soccer ball, this would suggest that the acceleration is performed as 67 rapidly as possible, and can therefore be described as a powerful action). Notational 68 analysis may therefore provide a more accurate description of the frequency and 69 duration of the complex powerful actions performed by individual players during 70 soccer match play (Dogramac et al., 2011).

To date, previous soccer notational systems coded sprints but not accelerations
(Bloomfield, Polman, & O'Donoghue, 2007; Faude et al., 2012), failed to report action
duration (Faude et al., 2012), and only reported the frequency of powerful actions
preceding goals (Faude et al., 2012) and during isolated random fifteen-minute periods

of games (Bloomfield et al., 2007). No study has provided a comprehensive description
of the powerful actions performed over the duration of a competitive soccer match.
Consequently, there is currently limited information available to inform the specific
detail of soccer-associated power assessment and training intervention protocols.

The primary aim of our study was to develop an objective soccer specific powerful action (SSPA) notational analysis coding system that could assess and compare the frequency and durations of various powerful actions during elite youth soccer match play. We also aimed to use this SSPA notational analysis coding system to describe the powerful activity profile of a sample of elite soccer players during youth English Premier League (EPL) soccer match play.

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Method

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88 Participants

89 Sixteen elite male soccer players registered to an EPL football academy provided 90 consent to participate in the study. The study was approved by the (deleted for 91 reviewing purposes) and complied with the Declaration of Helsinki (Ethics protocol 92 number: P13/SPS/033; approved 31/10/13). Soccer players were considered elite if 93 they had competed regularly (played over 12 competitive games in the previous 6 94 months) for one of the highest ranked (Category One) soccer academies in England, 95 according to the Elite Player Performance Plan (Premier-League, 2011) audit criteria 96 (only 24 out of 86 English soccer academies were awarded Category One status). Our 97 entire sample of elite soccer players competed regularly in Division One of the 98 Premier League 2 (the league for U23 Category One English academies). 99 Furthermore, 12 of the participants were also members of their respective youth

100 national teams, while three players had previously represented their senior national 101 team. Players' age, height, body mass, sum of seven skinfold sites (taken at the 102 biceps, triceps, subscapular, supraspinale, abdominal, mid-thigh, and calf) and 103 estimated % body fat were (mean \pm SD) 18.5 \pm 1.0 years, 1.81 \pm 0.07 m, 74.9 \pm 8.6 104 kg, 44.3 ± 7.1 mm and 7.9 ± 1.2 %. The sample of players included three central 105 defenders, three full backs, three central midfielders, three wide midfielders and four 106 center forwards. Three of the players were substituted at various time-points during 107 the second half. Therefore, their first-half performance data were reported but 108 removed from the statistical analyses.

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110 Equipment and Software

111 Individual player footage was filmed using digital video camera (Canon XM2, 112 Amstelveen, Netherlands) mounted on a stationary tripod (Libec, Arizona, USA). 113 Video footage was transferred to a desktop computer (Apple iMac, California, USA) 114 and then analyzed using performance analysis software (Sportscode Gamebreaker Plus, 115 Sportscode, NSW, Australia), operating at a frequency of 25 Hz. Speed testing (10 m 116 and 30 m sprint) was performed using a photocell timing system (Brower Timing 117 System, Salt Lake City, UT, USA). Seven of the players wore 10 Hz global position 118 system (GPS) technology (STATSports, Newry, Northern Ireland) for complete 90 min 119 matches.

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121 Experimental Design

Firstly, a SSPA coding system was developed. Once the contents validity evidence, intra-observer and inter-observer objectivity of the SSPA coding system were established, sixteen players were filmed with an individual camera and the SSPA 125 coding system was used to analyze the powerful activity profile performed by each126 player.

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128 Soccer Specific Powerful Action Coding System

129 A video based player tracking notational analysis SSPA coding system was 130 developed during five sequential stages (Brewer & Jones, 2002). Considering the 131 limitations of previous soccer coding systems, it seemed appropriate initially to clearly 132 define what actions can be considered powerful and hence could be incorporated into a 133 notation system. A powerful action was defined as an effort that was performed as (or 134 nearly as) explosively as possible. The identification of powerful actions was therefore 135 based on the researcher recognizing circumstances in which the player performed an 136 explosive effort. For example, accelerations and sprints were considered powerful 137 actions in situations when the player was perceived to be aiming to travel to a specific 138 area of the pitch as quickly as possible. Such actions were generally performed under 139 circumstances which required the player to advance towards the ball before an 140 oncoming opponent, move away from an advancing opponent, or travel to a specific 141 area of the pitch in an attempt to gain possession of the ball from an opponent. Vertical 142 jumps were considered powerful actions when it was assumed that the player was 143 attempting to meet the ball at its highest point and therefore, jumping as high as 144 possible.

The researcher initially filmed pilot video footage of four different players and observed this pilot video footage in real time, and in slow motion, and developed a broad categorisation of SSPAs by identifying discrete movements that were perceived as being performed as (or nearly as) explosively as possible. The SSPA coding system is detailed in Tables 1 and 2. As acceleration (10 m linear speed assessment time) and 150 sprint (30 m linear speed assessment time) capabilities are independent attributes in 151 soccer players (Little & Williams, 2005), it was thought to be important to ensure that 152 the SSPA coding system included specific criteria to allow the frequency of both of 153 these types of powerful actions to be coded. The average 10 m linear speed assessment 154 times for the elite youth academy players recruited for the current study was $1.72 \pm$ 155 0.07 s. As these 10 m sprint times were similar to those previously reported in sample 156 of Premier League footballers that also included international players (1.69 \pm 0.08 s; 157 this cohort included 14 players with 6 internationals; Cotte & Chatard, 2011), we 158 believed it was an accurate representation of the acceleration capabilities within this 159 cohort. Therefore, when the player had accelerated as (or nearly as) explosively as 160 possible for more than 1.72 s, it can be assumed that they have progressed through the 161 acceleration phase and now transitioned into performing a sprint action.

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163 xxxxxxxxx Table 1 and 2 near here xxxxxxxxxx

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165 The contents validity of the SSPA coding system was established via 166 interactions with an expert panel (n=5) that included one experienced applied football 167 researcher, practitioner and university professor, one video analyst and two sport 168 scientists, all currently employed by English Premier League Clubs. These specialists 169 were invited to review and validate the coding system. This process consisted of the 170 author explaining and demonstrating the coding classification system and receiving 171 verbal feedback on it during a series of meetings. Following these discussions, all the 172 specialists agreed with the SSPA coding system categories and rules. As a consequence, 173 the SSPA coding system was deemed a valid measuring tool for recording the most 174 frequent and important powerful actions performed during soccer match play.

175 Having established contents validity evidence for the SSPA coding system, the 176 intra-observer objectivity was then investigated to establish if the test-retest objectivity 177 for the principle researcher using the system was acceptable. Similarly, inter-observer 178 objectivity was investigated to establish whether the author, and an inexperienced 179 observer who had no previous experience of notational analysis methods, could record 180 the same movements, at the same time points, during the same game. The process for 181 investigating the intra- and inter-observer objectivity of the SSPA coding system is 182 illustrated in Figure 1.

To investigate the intra-observer objectivity, the researcher initially viewed the individual player video footage of a single full competitive game and coded the powerful actions based on the criteria of the SSPA coding system being assessed. Twelve days later, the same researcher then repeated this analysis process again, coding the powerful actions during the same individual player video footage. Game codes were extrapolated to timelines with a recording scale of 0.5 s (with the exception of vertical jump actions, removing actions <0.5 s duration). The two timelines were matched.

During the inter-observer objectivity procedure, an in-experienced observer was required to view the same individual player video footage of a full competitive game and code the powerful actions based on the criteria of the SSPA coding system being assessed. The game codes were extrapolated and the observer timeline (recording scale 0.5) was matched with the corresponding timeline from the same individual player video footage coded by the researcher during the intra- objectivity analysis.

The level of agreement between matched timelines was analyzed for intra- and inter-observer objectivity using kappa statistics (Figure 1). During the development of the SSPA coding system the intra- and inter-observer objectivity assessments were completed on three and two occasions, respectively (Figure 1).

201 xxxxxxxxx Figure 1 near here xxxxxxxxxx

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203 The comprehensive development of the SSPA coding system indicated that the 204 tool was an objective observational instrument for the coding of SSPAs. Following this 205 evaluation, the data collection procedures commenced in conjunction with GPS-206 derived acceleration data, which were collected simultaneously with our SSPA data. 207 This enabled us to compare our SSPA system with technology that is commonly used 208 to quantify powerful actions in the applied field. The GPS-derived accelerations were 209 recorded using wearable 10 Hz global position system (GPS) technology (STATSports, 210 Newry, Northern Ireland). Seven players wore the trunk-mounted GPS unit, positioned 211 in the mid scapula region as per manufacturer guidelines in a STATSports vest (Newry, 212 Northern Ireland), for complete 90 min matches (the same as coded using our SSPA 213 system). An acceleration was registered when the change in GPS speed increased for 214 at least half a second, with a maximal acceleration of over 3 ms⁻². We compared the 215 total number of accelerations throughout the game measured using GPS technology 216 with the total number of powerful accelerations (initial and leading accelerations) coded 217 using our SSPA coding system.

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219 **Procedure**

Filming was conducted during sixteen competitive EPL Academy Youth League soccer matches (thirteen U21 and three U18 League Games) in the 2013-2014, and 2014-2015 season. All games were played on a grass surface and filmed using a digital video camera (Canon XM2, Amstelveen, Netherlands) mounted on a stationary tripod (Libec, Arizona, USA). Individual players were recorded and tracked by an individual camera, which was zoomed to provide clear, unobstructed and close imagesof the specific player in question from an elevated position.

227 The video footage of each game was transferred to a desktop computer (Apple 228 iMac, California, USA) and then analyzed using performance analysis software 229 (Sportscode Gamebreaker Plus, Sportscode, NSW, Australia), operating at a frequency 230 of 25 Hz. Only actions when the circumstances would suggest that the player had to 231 perform an effort as (or nearly as) explosively as possible were coded according to the 232 categorisation criteria detailed in Table 1. The start and end points of powerful actions 233 were coded to provide frequency counts and action duration outcomes. The video 234 footage could be played back frame-by-frame, or in slow motion, to allow specific start 235 and end points to be identified. Specific criteria used to identify these time points are 236 illustrated in Table 2.

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238 Data Analysis

239 Due to the relatively low number of observations for both unilateral and bilateral 240 jumps, these actions were grouped together as one category (vertical jumps) for 241 analyzing differences within and between powerful actions. The whole dataset was 242 checked for normality and the frequency data for vertical jumps were not normally 243 distributed. Therefore, a Friedman's test was used to determine if there were 244 differences between the total frequencies of different powerful actions performed 245 during the whole game (initial accelerations, leading accelerations, sprints, vertical 246 jumps). Pairwise comparisons were performed with a Bonferroni correction to 247 determine specific differences between the different powerful actions. Wilcoxon 248 signed ranked tests were used to detect differences between the same powerful actions 249 performed during the first half compared to the second half. Wilcoxon signed ranked

250 tests were also used to detect differences between the number of powerful actions 251 performed in the two duration categories (0.5 - 1.49 s and \geq 1.5 s; these categories 252 were chosen as 1.49 s is below 1.72 s, which is the average 10 m maximal sprint time 253 for this group of players. This gives the practitioner a reference for the number of 254 maximal accelerations performed over a distance of less than 10 m) and the number 255 of unilateral compared to bilateral vertical jumps performed during the whole game. 256 Simple effect size, estimated from the ratio of the mean difference to the pooled SD, 257 was also calculated. Effect size ranges of <0.20, 0.21–0.60, and 0.61–1.20, 1.21–2.00, 258 and >2.00 were considered to represent trivial, small, moderate large, and very large 259 differences, respectively. To assess the level of agreement between SSPA and GPS 260 methods regarding frequency of (maximal/near maximal) accelerations for the seven 261 players, who wore the GPS unit for complete 90 min matches, we performed a 262 Student's paired T-test and also calculated the coefficient of variation, a two-way 263 random effect with absolute agreement intra-class correlation coefficient, and ratio 264 limits of agreement (Nevill & Atkinson, 1997). All statistical analyses were 265 completed using SPSS version 21 (SPSS Inc., Chicago, IL), and statistical 266 significance was set at p < 0.05. All data are expressed as mean \pm SD. 267 268 **Results** 269

270 Comparing The Frequencies of Powerful Actions

During a competitive soccer match, elite youth soccer players performed a total of 81 ± 18 powerful actions. There were significant differences between the frequency of actions performed during the match ($\chi^2(4) = 48.043$, p < 0.001). Pairwise comparisons revealed that players performed a significantly greater number of initial 275 accelerations and leading accelerations than vertical jumps during the whole game (p =276 0.002 and p < 0.001, respectively; Table 3), with these differences associated with large 277 effect sizes (d = 1.7 and d = 1.7, respectively). Similarly, a significantly greater number 278 of initial accelerations and leading accelerations were performed compared to sprints 279 during the whole game (p = 0.014 and p < 0.001, respectively; Table 3), with these 280 differences associated with large effect sizes (d = 1.7 and d = 1.7, respectively). There 281 was no difference in the number of vertical jumps performed compared to sprints during 282 the entire match (p = 1.000; Table 3), which was also associated with a small effect size 283 (d = 0.4). Likewise, players performed a similar number of initial and leading 284 accelerations during the whole game (p = 1.000; Table 3), which was also associated 285 with a small effect size (d = 0.6).

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287 Temporal Pattern of Maximal Actions

288 A significantly higher total number of powerful actions were performed during 289 the first compared to the second half of matches $(45 \pm 10 \text{ vs. } 37 \pm 10; \text{ Z} = -2.944, p =$ 290 0.003), with this difference associated with a moderate effect size (d = 0.7). More 291 specifically, players performed a significantly greater number of initial accelerations in 292 the first half (Z = -1.959; p = 0.050; Table 3), with this difference associated with only 293 a small effect size (d = 0.6). A higher number of leading accelerations (Z = -1.889; p =294 0.059; Table 3) was observed during the first, compared to the second half of the 295 matches though this difference was not significant, and this differences was associated 296 with a small effect size (d = 0.5). There was no difference between the numbers of 297 sprints (Z = -0.158, p = 0.874; Table 3) or vertical jumps (Z = -1.437, p = 0.151; Table 298 3) performed during either half, with such comparisons also associated with trivial (d299 = 0.1) and small effect sizes (d = 0.4), respectively.

301 Duration of Powerful Actions

There were significantly greater number of initial accelerations (Z = -3.189, p303 = 0.001; Table 3), leading accelerations (Z = -3.115, p = 0.002; Table 3), and sprints (Z 304 = -2.325, p = 0.020; Table 3), performed that lasted for durations between 0.5-1.49 s 305 compared to the number of these activities performed for more than 1.5 s. These 306 differences in the number of initial accelerations, leading accelerations, and sprints, 307 were associated with large (d = 1.6), large (d = 1.4) and moderate (d = 0.7) effect sizes, 308 respectively.

309

Jump Type Frequency

There was no difference in the total number of unilateral compared to bilateral jumps performed during the matches $(3 \pm 3 \text{ vs. } 3 \pm 3; \text{Z} = -3.180, p = 0.437)$. The range of total vertical jumps performed, however, was large (Total vertical jumps: 2 – 18).

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315 xxxxxxxxx Table 3 near here xxxxxxxxxx

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317 Comparing frequency of accelerations measured with SSPA and GPS methods

The frequency of "maximal" accelerations determined via GPS (49.6 \pm 25.0) was lower than the number of total accelerations determined by SSPA (68.3 \pm 19.7, t₆ = -3.45, *p* = 0.014). The intraclass correlation coefficient between the two methods was 0.755 (95% CI: 0.111 – 0.969; *p* = 0.009), and the coefficient of variation was 27.5%. The ratio limits of agreement were 1.478 (*/ \div 1.838). The bias ratio (1.478) implies that SSPA coded the frequency of maximal (or near maximal) accelerations on average 47.8% higher than those quantified using GPS, while the agreement ratio (*/ \div 1.838)

indicates that 95% of the agreement ratios lay within 83.8% above or below the mean
bias ratio. Thus, we can state that the agreement between the two methods for
quantifying frequency of maximal (or near maximal) accelerations was poor.

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Discussion

330 Our study aimed to develop a notational analysis coding system that could 331 characterize the powerful activity profiles of elite youth soccer players in sufficient 332 detail to inform the detail of maximal power assessment and development protocols. 333 The main finding was that our SSPA coding system provides a highly objective 334 observational instrument for quantifying the frequency and duration of powerful 335 actions performed during elite soccer match play. In the sample of elite youth soccer 336 players subsequently analyzed using the SSPA coding system, we show that over the 337 course of a competitive game, EPL youth players performed a significantly greater 338 (associated with a large effect size) number of initial and leading accelerations 339 compared to both sprints and vertical jumps. Action duration data showed that the 340 majority of initial accelerations (large effect size), leading accelerations (large effect 341 size) and sprints (moderate effect size) performed over the course of a game lasted less 342 than 1.5 seconds. Our findings suggest that accelerations of short duration (<1.5 343 seconds), from different starting speeds that are oriented in the horizontal direction, are 344 the most dominant powerful action in elite youth soccer match play. This information 345 suggests that soccer-associated maximal power assessment and development protocols 346 could specifically focus on evaluating and enhancing the ability to perform horizontal, 347 rather than vertical, powerful actions.

348 If a video based player tracking notational analysis coding system is to be used349 to provide information to inform the prescription of assessment and training strategies

350 for elite soccer players, it is imperative that the coding system has been validated and 351 shown to be objective for observers using the instrument. By consulting a range of 352 experts in the field in series of meetings we have also provided very good content 353 validity evidence that the SSPA coding system is representative of the powerful actions 354 performed during soccer match play. The large kappa coefficients (≥ 0.827) calculated 355 in the intra- and inter-observer objectivity analyses procedures demonstrates that the 356 SSPA coding system is objective for both the researcher, and an inexperienced 357 observer. Our findings therefore show that the SSPA coding system developed can be 358 used with a high level of objectivity by other researchers in future studies to quantify 359 the frequency and duration of powerful actions performed during soccer match play. 360 As such detailed information is lacking in the current body of literature, we believe the 361 SSPA coding system can serve as a platform for innovative future research that could 362 provide the applied practitioner with detailed information to inform maximal power 363 assessment and development processes in a soccer specific context.

364 Considering automated time motion analysis systems, utilizing GPS 365 technology, have been commonly used to quantify "high intensity" aspects of a soccer 366 match, we decided to compare the frequency of "maximal" accelerations identified via 367 our SSPA method with that identified via GPS. Although the intraclass correlation 368 coefficient was moderate, the large confidence intervals, the extremely wide ratio limits 369 of agreement and high coefficient of variation showed there was poor agreement 370 between the SSPA and GPS derived maximal (or near maximal) accelerations. Given 371 that the objectivity and validity of 10 Hz GPS for measuring accelerations is compromised for those over 4 ms⁻² (Akenhead et al., 2014), it is clear that the 10 Hz 372 373 wearable GPS units are not suitable for accurately assessing the number of soccerspecific high intensity activities. Moreover, the speed and acceleration capabilities of 374

375 our elite youth soccer players varied (range in 10 m sprint performance substantially: 376 1.53 - 1.75 s; range in 20 m sprint performance: 2.72 - 3.02 s), thus implying that some 377 players surpassed the generic maximal acceleration threshold when eliciting only 378 submaximal efforts, whereas other players may not have surpassed this generic 379 threshold even when performing maximal/or near maximal accelerations. Considering 380 these two factors, it is therefore not surprising that we found a discrepancy in the 381 number of powerful accelerations when comparing the results from an automated time 382 motion analysis system (with compromised validity and objectivity), with our SSPA 383 coding system, which has been shown to have very good intra- and inter-observer 384 objectivity. Our work further illustrates the limitations of using automated time motion 385 analysis systems for describing the powerful activity profile in elite soccer. The 386 discrepancy in results signifies the importance of our study for providing an accurate 387 and objective representation of the powerful activity demands of youth soccer.

388 Unlike previous notational analysis coding systems (Bloomfield et al., 2007; 389 Faude et al., 2012), our SSPA coding system documented the number and type (initial 390 or leading) of powerful accelerations performed throughout the duration of a whole 391 game [as opposed to just before goals scored (Faude et al., 2012), or during isolated 15-392 minute periods (Bloomfield et al., 2007)]. Moreover, unlike previous notational 393 analysis coding systems (Bloomfield et al., 2007; Faude et al., 2012), we also included 394 the action duration, which gives valuable information for the practitioner that may 395 inform the rep duration of speed/agility or conditioning drills, and the specificity power 396 development protocols. By also being the first study to include the type of jump action 397 (unilateral or bilateral), we provide innovative information that may be used to inform 398 soccer specific power assessment and development protocols. We believe the 399 information provided in our study provides the most objective and comprehensive

400 available description of the detail of powerful actions performed over the duration of a401 competitive soccer match.

402 Using the SSPA coding system to analyse a sample of elite youth soccer players 403 during youth EPL match play, we show that these players undertook 8~fold more 404 horizontal accelerations than sprints (~68 vs. 8, respectively), thus suggesting 405 horizontal acceleration is a more dominant action (Table 3). We also show that elite 406 EPL youth soccer players performed 11~fold more horizontal accelerations (initial and 407 leading accelerations combined) than vertical jumps (~68 vs. 6, respectively) during a 408 competitive match. Subsequently, our data suggests that powerful efforts oriented in 409 the anterior-posterior and mediolateral directions are performed more frequently during 410 elite EPL youth soccer match play than efforts oriented the vertical direction. 411 Considering it has been previously documented that unilateral jump capabilities in 412 different directions are independent qualities that require different muscle activation 413 profiles (Murtagh et al., 2017) and should be assessed and developed separately 414 (Meylan, Nosaka, Green, & Cronin, 2010), our data in this sample of EPL players 415 suggests that future soccer specific power assessment and development protocols 416 should prioritize anterior-posterior and mediolateral power production. More 417 specifically, our findings suggest that horizontal jump assessments (rather than vertical 418 jumps which are the most common assessment employed currently at elite soccer clubs), should be prioritized in elite soccer assessment protocols. However, the range 419 420 in vertical jump frequency in the current study (2-18) may also suggest that this capacity 421 is more important for some positions than others, or perhaps dependent on the type of 422 game and opposition. Our innovative data therefore makes the soccer practitioner aware that certain EPL youth players may be required to jump in the vertical direction more 423

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frequently. Subsequently, vertical power training may be prescribed on an individual basis depending on how often the player is required to jump vertical in a game.

426 To optimize muscular power assessment and development programmes for soccer players, knowledge of the detail of these actions is important. The majority of 427 428 horizontal accelerations and sprints were performed for durations of less than 1.5 s 429 (Table 3). This information suggests that short duration explosive horizontal efforts are 430 the most dominant powerful action during elite youth EPL soccer match play. These 431 findings are in agreement with Cometti and Colleagues (2001) and, as acceleration 432 performance has been associated with horizontal-forward jump performance (Dobbs, 433 Gill, Smart, & McGuigan, 2015), these findings may further support the inclusion of 434 this assessment in elite soccer talent identification protocols. In addition, this data from 435 our sample of EPL players also suggests that the most frequent action included in soccer 436 specific speed, and soccer speed endurance development drills, should be explosive 437 short duration maximal accelerations (<1.5 s).

Our study is the first to categorize accelerations as initial or leading, based on the inertia that the player is required to overcome before initiating the acceleration. As there was no difference (and small effect size) in the number of initial and leading accelerations completed by EPL youth soccer players (Table 3), our results show that both of these actions are should be developed simultaneously during soccer training interventions.

Analyzing the effect of time on the frequency of powerful actions may also provide useful information for the prescription of soccer conditioning programmes. Elite EPL youth soccer players performed fewer maximal actions in the second half in comparison to the first half. More specifically, significantly fewer initial accelerations, and a tendency for fewer leading accelerations, were performed in the second half, thus 449 suggesting that powerful horizontal actions were reduced as a function of time. 450 However, these differences between halves for initial and leading accelerations were 451 associated with small effect sizes. Due to the complexity of factors that could influence the reduction in running performance during soccer match play (Paul, Bradley, & 452 453 Nassis, 2015), the significance of these findings is not yet known from a practical or 454 theoretical perspective. Nevertheless, our data may suggest that soccer practitioners 455 could aim to apply specific conditioning interventions to help players perform initial 456 accelerations more frequently during the second half of competitive matches. Such 457 interventions could include high intensity conditioning drills that include the 458 performance of maximal accelerations, from static or walking starts, in the latter stages 459 of the session when a certain level of fatigue has been accumulated.

460 Although our cohort included 12 international standard players from six 461 different countries, a limitation of our study was that all 16 elite youth players, who 462 participated in this study, represented the same English Premier League Academy at 463 U18/U21 level. Thus, our results may not be indicative of soccer powerful activity 464 profiles in other age groups or in teams competing in other leagues in different 465 countries. Moreover, as we only included 16 elite youth players, our study should be 466 repeated with a larger sample size to confirm our findings are representative of EPL 467 youth soccer match play. Future research could therefore recruit larger cohorts and 468 focus on using our SSPA coding system to compare the powerful action demands at 469 different age groups and in elite soccer clubs playing in different countries

In conclusion, the current study developed a video-based player tracking notational analysis coding system that could be used to provide a highly objective account of the powerful actions performed during elite soccer match play. In our sample of elite EPL youth soccer players analysed, vertical jumps and sprints were performed 474 less frequently than both initial and leading horizontal accelerations. The results
475 showed that initial and leading horizontal accelerations of short duration (< 1.5 s) are
476 the most frequently performed powerful actions during elite youth soccer match play.
477 In comparison to the first half, EPL youth soccer players performed significantly fewer
478 initial accelerations during the second half.

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What Does This Article Add?

481 Our study provides evidence that a notational analysis coding system can be 482 used to provide soccer practitioners with an insight into the powerful action demands 483 of EPL youth soccer match play. The detail that the SSPA coding system describes such 484 powerful actions may be used to inform the specificity of soccer specific physical 485 assessment and development protocols. As the most dominant action performed by the 486 sample of elite youth EPL soccer players in our study were horizontal accelerations 487 from different starting speeds, our data suggests the assessment and development of the 488 ability to produce horizontal impulse from static or walking speeds, but also from 489 moving speeds, should be prioritized within the athletic development protocols applied 490 at elite youth soccer clubs. We also show that elite youth soccer players are required to 491 perform powerful vertical jump and sprint actions, and whilst these capabilities may 492 also be important to assess and develop, they should not be prioritized over the ability 493 to perform short duration horizontal accelerations. The vertical jump requirements of 494 EPL youth soccer match play were varied (range between 2-18) and therefore, the 495 ability to produce vertical power may be more important for specific players. Analyzing 496 the temporal patterns of powerful actions shows that the specific action that was 497 performed less frequently during the second half was the initial acceleration.

498	Practitioners may aim to improve the ability to perform this action in conditioning		
499	programmes tailored towards improving second half physical performance.		
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Category	Definition
Initial acceleration	Very high-intensity horizontal acceleration where the player propels their body in the forward or sideways direction whilst initiating the first propulsion when either static, walking, or after changing direction.
Leading acceleration	Very high-intensity horizontal acceleration where the player propels their body in the forward or sideways direction whilst initiating the first propulsion when performing a movement that cannot be defined as static, walking or changing direction.
Sprint	If the player is perceived to continue to perform the very high intensity acceleration effort for over 1.72 s, the acceleration now turns into a sprint action. At this time point the acceleration terminates and a sprint action will begin.
Bilateral jump	Very high-intensity propulsion of body off two legs in a primary vertical direction with only partial horizontal direction. This must have a clear identifiable take off and flight phase.
Unilateral jump	Very high-intensity propulsion of body off one leg in a primary vertical direction with only partial horizontal direction. This must have a clear identifiable take off and flight phase. This category can include actions such as jumping to control the ball and does not necessarily have to be a jump for a header.
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Table 1. Soccer specific powerful action (SSPA) coding system categories and definitions.

Table 2. Criteria for defining start and end point of all powerful actions.

Start point of powerful actions:

- The beginning of all powerful actions was defined as the moment that the players' foot first made contact with the ground immediately before initiation of the first explosive propulsion of the movement.
- On the rare occasion that the player initiated the powerful action from a static stance with both feet in contact with the ground, the action began at the instance (time frame before) marked by the first noticeable extension of ankle, knee or hip.

End point of powerful actions

- All powerful actions ended one-time frame before the first ground contact of the deceleration or landing phase.
- The deceleration phase of horizontal actions began when the player's stride pattern changed and his landing foot contacted the ground in front of his center of mass acting to slow him down.
- This was often marked by a heel strike when the foot initially made ground contact.

	Initial acceleration	Leading acceleration	Sprint	Vertical jump
Total	31 ± 9^{cd}	37 ± 12^{cd}	8 ± 3 ^{ab}	6 ± 5 ^{ab}
1 st Half	17 ± 5 $^{\#}$	20 ± 7	4 ± 2	3 ± 3
2 nd half	14 ± 5	16 ± 6	4 ± 3	3 ± 2
Action duration 0.50-1.49 s	22 ± 6 ^{&}	25 ± 9 ^{&}	5 ± 2 &	N/A
Action duration > 1.50 s	9 ± 4	12 ± 4	3 ± 2	N/A

Table 3. Absolute frequencies of powerful actions during elite youth soccer match play (n=16); mean \pm SD.

Post hoc tests: ^a Significantly different to the frequency of initial accelerations, ^b Significantly different to the frequency of leading accelerations, ^c Significantly different to the frequency of sprints, ^d Significantly different to the frequency of vertical jumps; [#] Significantly different to the frequency of the same powerful action performed in the 2nd half; [&] Significantly different to the frequency of the same powerful action performed for a duration > 1.50 s (p < 0.05).

587 Figure 1



Figure. 1 An illustration of the intra- and inter- observer reliability (objectivity) process.