1	Characterising coordination strategies during initial acceleration in sprinters
2	ranging from highly trained to world class
3	
4	Byron Donaldson ¹ *, Neil Bezodis ² , Helen Bayne ¹
5	
6	¹ Sport, Exercise Medicine and Lifestyle Institute (SEMLI) and Division of Biokinetics and Sport Science,
7	Department of Physiology, University of Pretoria, South Africa
8	
9	² Applied Sports, Technology, Exercise and Medicine (A-STEM) Research Centre, College of Engineering,
10	Swansea University, United Kingdom
11	
12	*Corresponding Author: Byron Donaldson (byron.donaldson@protonmail.com)
13	
14	ORCID:
15	
16	Donaldson: 0000-0002-7435-7614
17	Bezodis: 0000-0003-2229-3310
18	Bayne: 0000-0002-2520-4937
19	
20	
21	
22	
23	
24 25	
25 26	
20 27	
28	
29	
30	
31	
32	
33	
34	
35	

36 Abstract

37

38 Identifying the coordination strategies used by sprinters and the features that differentiate these strategies will 39 aid in understanding different technical approaches to initial sprint acceleration. Moreover, multiple effective 40 coordination strategies may be available to athletes of similar ability levels, which may be masked in typical 41 group-based analyses. This study aimed to identify sub-groups of sprinters based on their thigh-thigh and shank-42 foot coordination during initial acceleration, and to assess sprint performance across different combinations of 43 coordination strategies. Segment angular kinematics were obtained from 21 sprinters, and coordination was 44 determined using modified vector coding methods, with step 1 and steps 2-4 separated for analysis. Sprint 45 performance was assessed using metrics derived from the velocity-time profile. Using hierarchical cluster 46 analysis, three distinct coordination strategies were identified from thigh-thigh and shank-foot coordination in 47 step 1 and two strategies in steps 2-4. Coordination strategies primarily differed around early flight thigh-thigh 48 coordination and early stance shank-foot coordination in step 1, while the timing of reversals in thigh rotation 49 characterised differences in later steps. Higher performers tended to have greater lead thigh and foot dominance 50 in step 1 and early swing thigh retraction in steps 2-4. The novel application of cluster analysis to coordination 51 patterns provides new insights into initial acceleration technique in sprinters, with potential considerations for 52 training and performance.

53

54 Keywords: Acceleration, kinematics, performance, sprinting, track and field

55 Introduction

56

57 Acceleration performance depends on positioning body segments and coordinating their rotations to effectively 58 apply forces to the ground to propel the body forward [1–5]. In practical settings, a popular method for analysing 59 sprint technique involves a sequence of images from key events, as demonstrated by the kinogram method [6]. 60 These images depict 'shapes' [6], and whilst practitioners may visually consider the relations between segments, 61 biomechanical investigations have typically focused on isolated joints or segments which do not facilitate easy 62 interpretation of the relative motion of these elements, i.e. their coordination. Coordination thus describes the 63 relative rotation of two functionally linked segments, aiding understanding of the transition from one key event 64 ('shape') to another [7-9]. From a dynamical systems perspective, coordination emerges spontaneously from 65 interacting individual, task and environmental constraints in a self-organising manner [10-13]. In acceleration, 66 multiple technical strategies could therefore lead to the same performance outcome depending on the particular 67 interaction between the individual, task, and environment - a feature known as degeneracy [14, 15]. Wild et al. 68 [15] demonstrated this concept by showing that professional rugby backs could be clustered into four distinct 69 sprint acceleration strategies based on the ratios of step length/frequency and contact time/flight time,but that no 70 one strategy led to better acceleration performance. Such a characterisation of strategies remains unexplored 71 from a coordination perspective, or in a trained-trained population.

72

73 The hip and ankle play important roles during the block phase and first steps of acceleration, with a relatively 74 more minor role for the knee [16-20]. Jacobs and van Ingen Schenau [21] showed that sprinters accelerate the 75 centre of mass through 'rotation' then 'extension' of the stance (i.e., support) limb. This aligns with the 'shin roll' 76 framework proposed by Alt et al. [22], which describes shank rotation over the foot during stance in sprinting, 77 potentially accounting, at least partly, for the 'rotation' component [21]. However, the foot is not a static base 78 during stance and is an important component of ankle dorsi- and plantarflexion motions during ground contact 79 [17, 19, 20]. Regarding the hips, bipedal gait inherently requires cyclic limb interchange [23], and Clark et al. 80 [24] have shown the importance of large amplitudes of thigh separation and high frequencies of interchange to 81 maximal velocity performance. Moreover, thigh action helps set up lower limb touchdown positions from which 82 rotation occurs. Thus, characterising inter-limb thigh-thigh coordination can enhance the understanding of this 83 interchange between limbs while intra-limb shank-foot coordination strategies can enhance the understanding of 84 the adjacent segment rotations that comprise ankle motion.

85

Existing coordination and kinematic studies in acceleration have typically relied on a priori grouping based on criteria such as performance level, sprint event or task modification, when attempting to identify distinguishing kinematic parameters between groups [7, 8, 25]. However, such criteria are not always available or appropriate, especially in relatively homogeneous or continuous samples without clear divides. Moreover, a priori grouping

90 ignores potential between-individual variation within groups, masking instances where different movement 91 patterns can be used to produce the same performance outcome [15]. Whilst some researchers have suggested 92 individualised profiling to address this limitation [26], such an approach overlooks the possibility that strategy 93 sub-groups exist, owing to similarities in constraints between certain performers, as has been suggested in other 94 running contexts [27]. Grouping sprinters based on similar coordination strategies and consequently exploring 95 the frequency with which different strategies are adopted, and whether any strategies are typically associated 96 with better performance outcomes, could therefore further develop knowledge regarding initial acceleration 97 technique. While recent studies have described coordination during sprint acceleration [8, 28], none have 98 attempted to understand acceleration technique and performance through sub-groups of coordination strategies. 99 Given the considerable practical interest in the kinematics of effective acceleration, it is important to identify and 100 explain the strategies adopted by sprinters, and the potential performance implications of each strategy. This will 101 assist practitioners in assessing the technical approach of their athletes and designing individual specific 102 interventions for training.

103

104 The purpose of this study was, firstly, to identify and characterise sub-groups of sprinters with similar 105 coordination strategies during initial acceleration, and to assess whether different sub-groups are associated with 106 differences in key discrete kinematic measures. Having analysed the coordination strategies of the different sub-107 groups, the second purpose was to compare performance between the sub-groups with a view to understanding 108 whether certain strategies may be more beneficial for higher initial acceleration performance.

109

110 Methods

111

112 Fifteen male (age = 22.0 ± 3.6 yrs, stature = 1.77 ± 0.06 m, mass = 74.6 ± 9.7 kg, 100 m personal best = 9.89 -113 11.17 s) and six female (age = 22.8 ± 6.5 yrs, stature = 1.62 ± 0.05 m, mass = 54.1 ± 2.2 kg, 100 m Personal best 114 = 11.45 - 12.14 s) sprinters were recruited using convenience sampling and provided informed consent to take 115 part in this study. All participants were 100 m and 200 m specialists, in the competition phase of their season, 116 and injury free at the time of testing. According to the criteria of McKay et al. [29], fourteen sprinters (9 M, 5 F) 117 were classified as highly trained, five as elite (4 M, 1 F) and two (2 M) as world class. For the purposes of our 118 analysis, all were initially considered as part of a single cohort from which the sub-groups were subsequently 119 determined using cluster analysis based on their coordination profiles. All procedures were performed in 120 accordance with the declaration of Helsinki and the institutional research ethics committee approved the protocol 121 (612/2020).

122

Participants performed three maximal effort sprint trials of at least 20 m, starting from blocks, in their own spikes. These were part of their typical sprint training and took place during regular training sessions in the 125 competition phase of the season. Participants completed their habitual warm ups, and at least five minutes 126 separated each trial to minimise the effects of fatigue.

127

128 Three-dimensional (3D) kinematics were recorded using tri-axial inertial measurement units (IMUs) (200 Hz; 129 MyoMotion, Noraxon, USA), the validity and reliability of which have been previously reported [30-33]. Nine 130 IMUs were affixed, according to manufacturer instructions, to the upper spine (T1), lower spine (T12), sacrum, 131 lateral aspect of both thighs, antero-medial aspect of both shanks and the dorsal surface of each foot. All were 132 secured using double-sided tape and either self-adhesive bandages or custom velcro straps to limit movement 133 due to impact forces [28]. A sagittal plane camera (120 Hz, Ninox-250, Noraxon, USA) recorded the first four 134 steps of each trial. IMU and video data were captured simultaneously and synchronised in real time with the 135 MyoSync device and MyoResearch 3.14 software (Noraxon, USA). IMUs were calibrated in an upright standing 136 posture prior to each trial with standardised instructions to establish the 0° reference angle, according to a 137 previously described protocol for which good reliability has been established for this IMU system [30, 34]. 138 Touchdown and toe-off were determined from video, with touchdown defined as the first frame with visible 139 ground contact and toe-off the first frame where the foot was no longer visibly contacting the ground. Steps were 140 defined from toe-off until the subsequent toe-off of the contralateral foot, starting from front foot block exit 141 (TO₀). Flight time was determined as the time from toe-off until touchdown of the contralateral foot and contact 142 time as the time from touchdown until toe-off. Limbs were designated as leading or trailing based on their 143 relative position at the beginning of the step (i.e. toe-off) [8, 24]. Due to the cyclic nature of sprinting, whether 144 the right or left leg was leading or trailing alternated at each toe-off. Angles of the trunk, lead and trail thigh, and 145 lead limb shank and foot were extracted and defined according to the 0° reference angle of the standing 146 calibration posture [28, 30]. All kinematic variables were time normalised to 101 data points for each step. 147 Finally, average angular velocity over the entire step was determined for lead and trail thigh according to the 148 methods of Clark et al. [24].

149

For each trial, a radar gun recorded instantaneous horizontal velocity (47 Hz; Stalker Pro II ATS, Stalker, USA). A simple macroscopic model was fit to velocity-time data, from which split times and force-velocity variables were extracted [35-36] using the shorts R package [37]. Theoretical maximum horizontal force (F_0), theoretical maximum velocity (V_0), maximum power (P_{Max}), maximum ratio of the horizontal force component to the resultant force (ratio of forces; RF_{Max}) and the slope of the relationship between RF and velocity (D_{RF}) were determined from the model, which have been shown to have a grand average bias of 4.7% and reliable within 2.4% for kinetic variables [36].

157

Inter-limb thigh-thigh and intra-limb shank-foot coordination were quantified from lead and trail thigh angles and lead limb shank and foot angles, respectively, using a modified vector coding technique [26, 28, 38]. Coupling angles (CA) were calculated as the angle of the vector between adjacent points relative to the right 161 horizontal for each pair of consecutive points on the angle-angle plot, representing a vector between 0 and 360°

162 describing the relative segment motion at each normalised time point (Figure 1(i)).



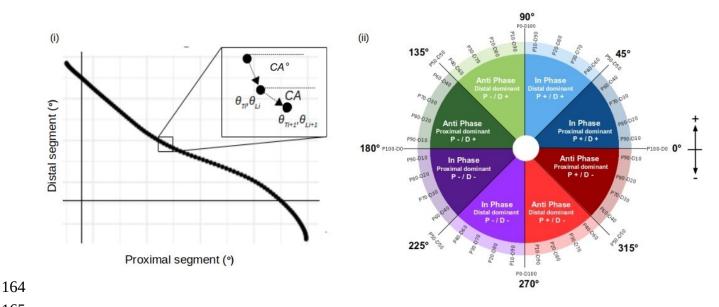




Figure 1: Example of angle-angle plot and coupling angle determination (i). Coordination bin classification system
(ii), adapted from [26, 28].

168

Every CA was classified into a discrete bin describing the primary motion and the dominant segment according to the segment dominancy approach presented by Needham et al. [26, 28](Figure 1(ii)). Couplings were described as proximal-distal, with the trailing thigh designated as the proximal segment. Rotations were described as clockwise-anticlockwise, as viewed from the right hand side, with anticlockwise rotation designated as positive (+) [28]. Thus, coordination bins are labeled by the relative motion, the dominant segment and the direction of rotation of the dominant segment. For example, thigh-thigh coordination with an anti-phase pattern and anticlockwise leading leg segment dominance is described as anti-phase leading (+) (Figure 1) [28].

The similarity of coordination for every possible pair of participants, for each coupling, was calculated according
to previously described methods [39], without the final subtraction from 1, producing a pairwise distance matrix
of coupling angle distance scores (CA_{dist}). Briefly, at each time point, the angular distance between
corresponding CA vectors (Figure 1(i)), θ, was calculated as follows:

180

$$\theta = \begin{cases} 360 - |A - B|, & \text{if } |A - B| > 180^{\circ} \\ |A - B|, & \text{otherwise} \end{cases}$$
(1)

For any pair of vectors, the maximum possible value of θ was 180°, representing directly opposite vectors.
Therefore the final CA_{dist} value was calculated as:

185

$$CA_{dist}(A,B) = \frac{\sum_{0}^{t} \theta(t)}{180t}$$
(2)

186

187

188 Where t represents the number of normalised time points (i.e. the 100 CA vectors between the 101 time-189 normalised data points), yielding a value between 0 (identical vector orientations at each time point) and 1 190 (directly opposite vector orientations at each time point). Distance matrices were computed for all pairwise 191 combinations of participants for thigh-thigh and shank-foot couplings. Previous studies identified step-to-step 192 changes in kinematics during initial acceleration [3, 40] while coaching [41], kinematic [18, 19] and 193 coordination [28] studies suggest that step 1 is different from later steps. Consequently, hierarchical 194 agglomerative clustering analyses with complete linkage method were performed separately for step 1 and steps 195 2-4 coordination. The final number of clusters in each case were identified based on the agglomerative 196 coefficient and visual inspection of the dendrograms [42-45].

197

198 Statistical Analysis

199

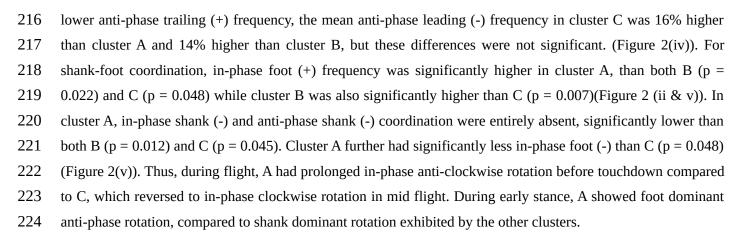
Group mean coordination profiles were determined for each cluster in step 1 and steps 2-4, and mean frequency (%) for each coordination bin was calculated. For each variable of interest, the normality assumption was assessed using a Shapiro-Wilks test. Between-cluster differences in bin frequency, linear and angular kinematic variables were assessed with Kruskal-Wallis and one-way analysis of variance (ANOVA) tests. Pairwise interactions between clusters were assessed with independent sample t-tests or Mann-Whitney U tests when two clusters were identified and Tukey or Wilcoxon signed rank tests for more than two clusters. All analyses were performed in R [46] using the *rstatix* [47] and *stats* [46] packages. Alpha level was set at 0.05.

207

208 Results

209

Three clusters were identified in step 1, labeled A, B and C (Figure 2(iii)). Cluster B accounted for 12/21 participants, with four and five in clusters A and C, respectively. Clusters A and B produced similar thigh-thigh coordination, with no significant differences in bin frequencies and only minor temporal visible differences in mean coordination profile (Figure 2(i & iv)). In contrast, cluster C produced significantly less in-phase trailing (+)(p = 0.044) and anti-phase trailing (+)(p = 0.032) than B (Figure 2(iv)). Participants in cluster C almost entirely lacked anti-phase leading (+) and in-phase leading or trailing (+) in early flight (Figure 2(i)). With the



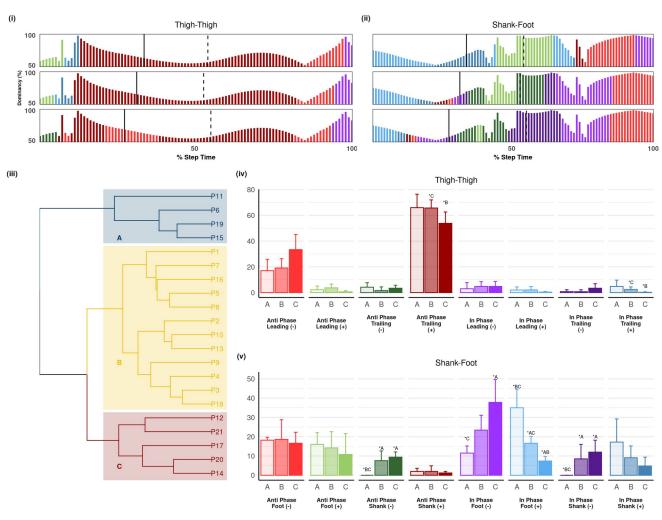


Figure 2: Step 1 mean coordination profiles for each cluster for thigh-thigh (i) and shank-foot (ii), dendrogram with clusters highlighted by colour (iii) and cluster mean coordination bin frequencies for each bin for thigh-thigh (iv) and shank-foot (v) couplings. Black vertical lines in figures (i) and (ii)indicate touchdown and dotted lines the thigh crossover in (i). The bin colours in (iv) and (v) serve as legends for (i) and (ii) respectively. *ABC annotations indicate significantly different to the respective (i.e. A, B or C) cluster, p < 0.05.

Two clusters were identified in steps 2-4, labeled X and Y (Figure 3(iii)). There were no significant differences in mean bin frequency across steps for any thigh-thigh bin (Figure 3(iv)). However, although in-phase leading (-) frequency was similar between clusters X and Y (Figure 3 (iv), participants in cluster X had in-phase coordination in late stance but those in Y had in-phase coordination during early flight (Figure 3(i)). Thus, cluster X began swing leg retraction in late stance whereas cluster Y only began at toe-off while continuing to rotate the stance leg clockwise after leaving the ground.

Cluster X had significantly less in-phase foot (+) than Y (p = 0.001), and had 5% more in-phase foot (-) coordination, but this was not significant (Figure 3(v)). Therefore, the primary difference between clusters was one of timing; participants in cluster Y spent longer in in-phase anti-clockwise rotation during flight and delayed the onset of anti-phase shank (-) and in-phase shank (-) coordination during stance (Figure 3(ii)).

242

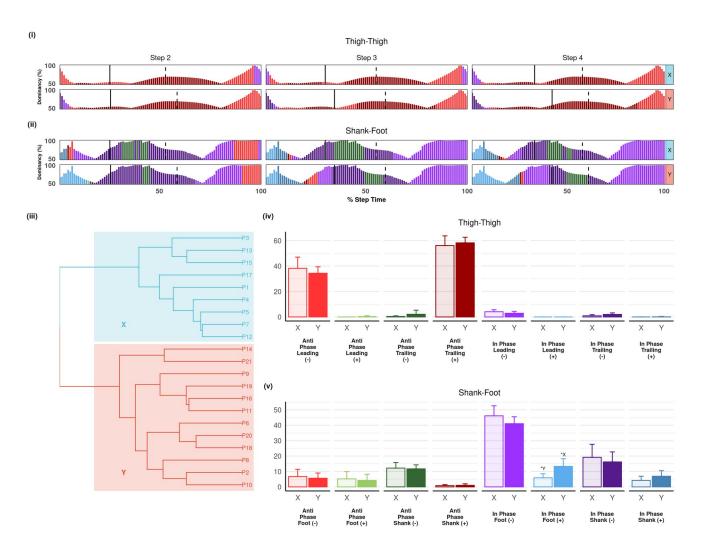
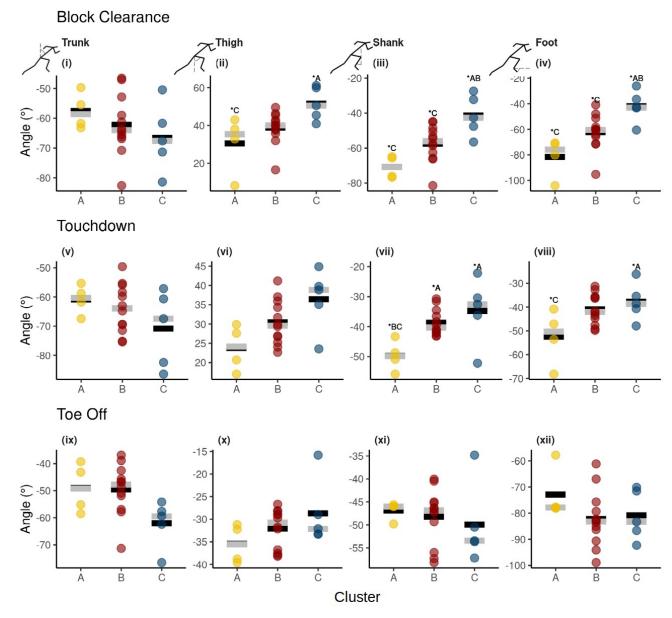


Figure 3: Step 2-4 mean coordination profiles for each cluster for thigh-thigh (i) and shank-foot (ii), dendrogram with clusters highlighted by colour (iii) and cluster mean coordination bin frequencies for each bin for thigh-thigh (iv) and shank-foot (v) couplings. Black vertical lines in figures (i) and (ii)indicate touchdown and dotted lines the

thigh crossover in (i). The bin colours in (iv) and (v) serve as legends for (i) and (ii) respectively. *XY annotations indicate significantly different to the respective (i.e. X or Y) cluster, p < 0.05.

249

250 At block clearance, thigh, shank and foot orientations differed between clusters (Figure 4(ii-iv)). Cluster C had 251 significantly more vertical shank and horizontal foot orientations than both B and A, while B and A were also 252 significantly different for both segments (Figure 4(iii-iv)). Moreover, C had a significantly more flexed lead 253 thigh at block clearance compared to A and was 13° more flexed than B, but this was not significant (Figure 254 4(ii)). At touchdown, cluster A had significantly more horizontal shank orientations than both B (p = 0.011) and C (p = 0.031), as well as significantly more vertical foot orientations than C (p = 0.037)(Figure 4(vii-viii)). In 255 256 step 1, cluster A had significantly shorter contact times ($150 \pm 6 \text{ ms}$) than C ($194 \pm 25 \text{ ms}$, p = 0.015), but not B 257 $(174 \pm 22 \text{ ms})$ while there were no significant differences in flight times (A: 76 ± 9, B: 77 ± 13, C: 71 ± 13 ms) 258 or lead (A: -272 ± 48, B: -270 ± 33, C: -291 ± 21 °.sec⁻¹) and trail (A: 382 ± 39, B: 360 ± 46, C: 347 ± 12 °.sec⁻¹) 259 thigh angular velocities.



260

Figure 4: Discrete trunk, thigh, shank and foot segment angles at block clearance (i-iv), touchdown (v-viii) and toeoff (iv-xii) in step 1 for coordination clusters A, B and C. All angles are lead limb (designated at block clearance). Black horizontal bar represents the mean and the grey bar represents the median. *ABC annotations indicate significantly different to the respective (i.e. A,B or C) cluster, p < 0.05.

In steps 2-4, there were no statistically significant differences in mean touchdown and toe-off angular kinematics (Figure 5), nor did clusters differ significantly in contact times (X: 149 ± 17 , Y: 141 ± 13 ms) or flight times (X: 60 ± 13 , Y: 71 ± 14 ms). However, cluster X had significantly higher average lead thigh angular velocity (-399 ± $32 \circ .s^{-1}$) compared to cluster Y (-372 ± $26 \circ .s^{-1}$).

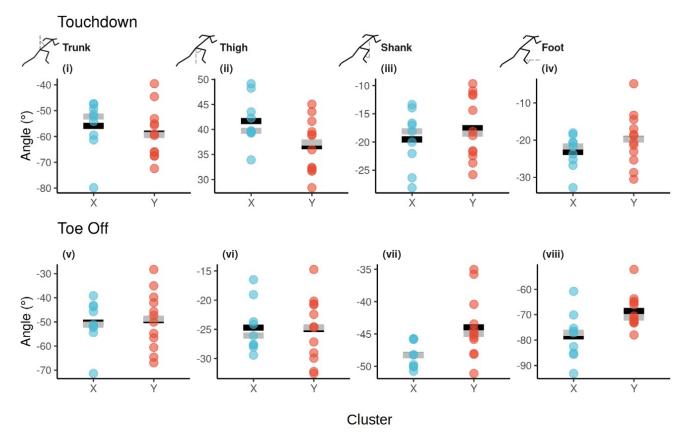


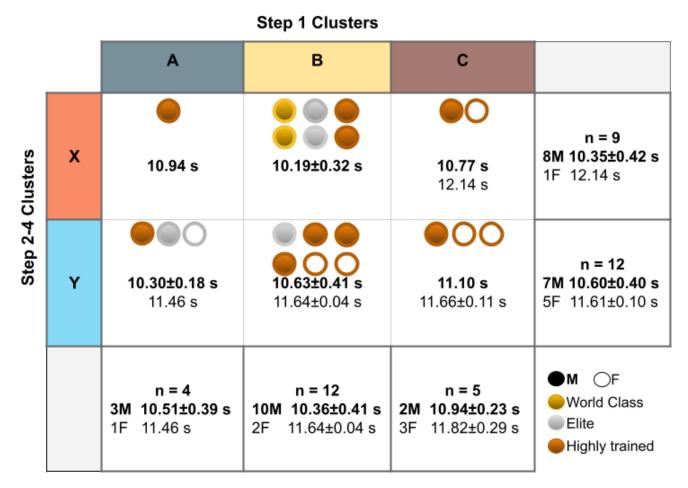
Figure 5: Discrete trunk, thigh, shank and foot segment angles averaged across steps 2-4 at touchdown (i-iv) and toeoff (v-viii) for coordination clusters X and Y. All angles are lead limb (designated at toe-off). Black horizontal bar represents the mean and the grey bar represents the median.

270

Before to comparing performance between clusters, male and female participants were compared to ensure that sex distribution across clusters did not influence comparisons. Performance levels in female participants were significantly lower across all performance variables (p < 0.001), except D_{RF} , compared to males. Given these between-sex differences in performance and the small number of female participants in the sample, females were excluded from between-cluster statistical comparisons of performance and only male athletes were compared. In males, no significant differences existed between step 1 or steps 2-4 clusters for any performance variable.

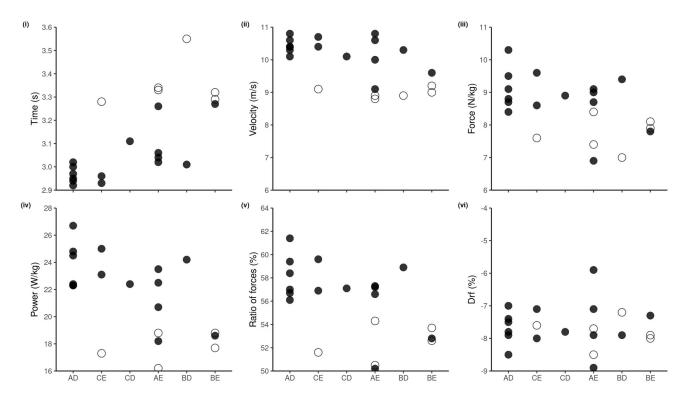
281

282 Six combinations were possible across the two sets of clusters (Figure 6). The two most common combinations 283 resulted from the twelve cluster B participants in step 1 dividing equally into X and Y in steps 2-4. Both world-284 class and two out of four elite male participants were in B-X, while B-Y and A-Y had one and two elite 285 participants respectively. Given the participant distribution, statistical comparisons between combinations was 286 restricted to the two most common: B-X and B-Y. Participants in B-X were significantly faster over 20 m (2.97 \pm 287 0.04 s) than those in B-Y (3.18 \pm 0.15 s, p = 0.02)(Figure 7(i)). Participants in B-X also produced higher F₀ (9.13 \pm 0.68 N.kg⁻¹), P_{max} (23.8 \pm 1.8 W.kg⁻¹) and RF_{max} (58 \pm 2%) than those in B-Y (F₀ : 8.25 \pm 0.90 N.kg⁻¹; P_{max} (20.0 288 289 \pm 2.8 W.kg⁻¹; RF_{max} (54 \pm 3%), but these differences were not significant.



290

Figure 6: Matrix demonstrating step 1 and steps 2-4 cluster combinations with sex, performance level and 100 m personal bests. Gold, silver and bronze colours denote performance level classification according to criteria of McKay et al. [29].



294

Figure 7: Performance variables for step 1 and steps 2-4 cluster combinations, 20 m time (i), theoretical maximal velocity $(V_0)(ii)$, theoretical maximal horizontal force $(F_0)(iii)$, maximal horizontal power $(P_{Max})(iv)$, ratio of forces (RF_{Max})(v) and degradation of RF (D_{RF})(vi). Closed and open points reflect male and female participants respectively. Note that the y axes do not begin at 0 for any variable to enable the between- and within-group variation to be visualised.

301 Discussion

302

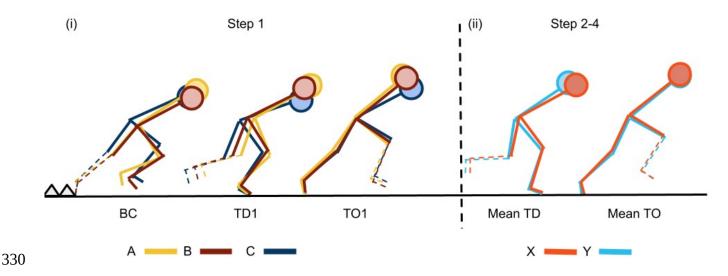
303 This study aimed to identify and characterise sub-groups of sprinters with similar coordination strategies during 304 initial acceleration and assess whether different sub-groups are associated with differences in kinematics at key 305 events and acceleration performance. Through a novel application of hierarchical cluster analysis to vector 306 coding data, three distinct lower-limb sprint acceleration coordination strategies were identified in step 1 and two 307 in steps 2-4. Clusters in step 1 were also associated with certain discrete kinematic differences at block clearance 308 and touchdown, while steps 2-4 clusters had no discrete kinematic differences at key events. Sprint performance 309 did not differ between clusters in either step 1 or steps 2-4, however when combined, clusters revealed a 310 potential coordination strategy associated with higher level sprinters and better sprint times.

311

In step 1, clusters A and B exhibited similar thigh coordination, characterised by lead thigh dominant anti-phase coordination (increased thigh separation) immediately after block exit followed by in-phase simultaneous thigh flexion before the lead limb reversed direction and retracted and the rear limb continued to flex through. The

315 subsequent limb interchange was trail thigh dominant. Participants in clusters A and B therefore tended to be

316 differentiated more by shank-foot than thigh-thigh coordination. During flight, cluster A displayed only in-phase 317 anti-clockwise shank-foot coordination while B exhibited a shorter period of in-phase rotation and had anti-318 phase coordination in late flight (Figure 8(i)). Thus cluster B demonstrated 'shin block' [22] - a reversal in shank 319 rotation direction before touchdown - which was absent in cluster A. This difference may relate to cluster A 320 displaying more horizontal lead limb shank orientations at block clearance compared to the other clusters (Figure 321 4(iii-iv)) - appearing to 'tuck' the shank beneath the thigh - requiring anti-clockwise rotation in flight to prepare 322 for touchdown. Cluster A dorsiflexion had entirely foot dominant anti-phase coordination, likely reflecting the 323 more horizontal shank orientation observed at touchdown, relying on 'heel drop' from a more vertical foot 324 during dorsiflexion and less 'shin roll' [22] from an already horizontal shank. Cluster B, on the other hand, 325 exhibited shank dominant coordination at the beginning and end of dorsiflexion with foot dominant coordination 326 in-between, suggesting initial 'shin roll' followed by 'heel drop' before further 'shin roll' towards the end of 327 dorsiflexion. These patterns associated with dorsiflexion were relatively longer in cluster A compared to B, 328 implying a relatively longer portion of stance in power absorption given the resultant plantar flexor moments 329 which are known to be present throughout the first stance phase [17].



331

Figure 8: Typical body orientations at key events for clusters in step 1 (i) and the average segment orientations over
 steps 2-4 (ii). Dashed lines indicate the limb that was not analysed. BC = block clearance; TD = Touchdown; TO =
 Toe-off.

335

In contrast to A and B, cluster C was trail thigh dominant after block clearance and had no in-phase coordination in early flight (Figure 2(i)). Thus, C didn't exhibit the same pattern of dominant lead thigh flexion, rather appearing to already approach the maximum lead thigh flexion angle at block exit (Figure 4(ii); 8(i)) and subsequently increased thigh separation after block exit through clockwise trail leg rotation (hip extension). These differences in trail thigh motion may result from differences in timing of muscle actions between groups [44] or be related to differences in strength profiles between groups, such that different strength profiles may 342 associate with different thigh-thigh coordination patterns, and further work to more directly explore this is 343 required. Moreover, cluster C had shorter in-phase anticlockwise shank-foot rotation during flight and prolonged 344 in-phase clockwise rotation before touchdown, indicating relatively earlier 'shin block' [22] compared to B. 345 Cluster C had correspondingly more vertical shank orientations at both block clearance and touchdown. Thus, 346 after block clearance they continued trail thigh extension before retracting the lead limb relatively earlier than 347 other clusters, 'planting' the leg down into ground contact. In stance, cluster C exhibited more shank dominant 348 anti-phase dorsiflexion, potentially indicating greater reliance on 'shin roll' [22] to translate the CM during that 349 period. Such reliance on 'shin roll' might link to the longer contact times observed in C and could also be related 350 to positive touchdown distance (foot ahead of CM), which has previously been associated with lower 351 performance (e.g. [48]). The current observations suggest that lead leg segment orientations at block clearance 352 may influence coordination during the subsequent flight and ground contact, yet these angles are rarely reported 353 and warrant further attention in both research and practice.

354

355 The main difference in thigh-thigh coordination between step 2-4 clusters was one of timing of reversals in thigh 356 rotation (Figure 3(i)). Cluster X exhibited an 'early retractor' strategy, retracting the swing thigh before toe-off, 357 resulting in in-phase clockwise coordination in late stance. This pattern continues momentarily in early flight 358 before the trail leg reverses to initiate anti-phase motion. Cluster Y exhibited the same general pattern, but began lead thigh retraction at toe-off and displayed longer in-phase clockwise rotation because the trail thigh continued 359 360 extending after toe-off. Thus showing a delayed swing leg recovery [24] which is sometimes termed 361 'overpushing' in applied practice. Cluster X was associated with significantly higher lead thigh angular 362 velocities compared to Y, which has been associated with faster running speeds during maximal velocity 363 sprinting [24]. Thus, early retraction might indicate earlier initiation of accelerating the lead thigh and therefore 364 facilitate higher angular velocities into the next step. By step 4, thigh coordination in X and Y more closely resembled each other, appearing to converge on the strategy typical of cluster Y. Clusters were also differentiated 365 366 by timing differences in shank-foot coordination (Figure 3(ii)). Cluster X displayed less anti-clockwise shank 367 and foot rotation during flight and a relatively shorter flight time, resulting in a relatively earlier ground contact 368 than Y, likely reflecting the early lead limb retraction. As a result, X exhibited relatively earlier shank dominant 369 anti-phase coordination during dorsiflexion, although dorsiflexion was shank dominant in both clusters. In 370 contrast to step 1, these timing differences between clusters in both couplings were not associated with any 371 differences in kinematics at key events (Figure 5, 8(ii)).

372

Of the six possible combinations of step 1 and steps 2-4 strategies, the majority of participants were either B-X (6) or B-Y (6) combinations, followed by A-Y (3) and C-Y (3), with A-X (1) and C-X (2) least common (Figure B). Thus, early retraction (X) or delayed swing leg recovery (Y) strategies in steps 2-4 were equally likely from participants in step 1 cluster B, but other step 1 clusters were less likely to correspond with early retraction. Of the two most common strategies, B-X was associated with higher performing athletes - including both world 378 class participants as well as two out of five elite participants whilst B-Y was almost entirely composed of highly 379 trained participants (Figure 6). In sprint tests, comparing only male athletes, the B-X combination had the fastest 380 20 m times and significantly faster times than B-Y. Thus, although there were no significant differences in 381 performance measures between isolated clusters from either step 1 or steps 2-4, the combination of clusters to 382 define a single initial acceleration strategy implies that a B-X strategy could be associated with better 383 performance. Further, although not significant, B-X athletes tended to perform better across force and power 384 variables, but not V_0 or D_{RF} . Thus, initial lead thigh dominant flexion in flight and 'shin block' in late flight (B) 385 in step 1 combined with early swing leg retraction (X) in later steps might be exhibited by physically stronger 386 athletes and therefore reflect a strategy allowing them to express their physical capacities. Further work is 387 required to investigate the relationships between coordination strategies and strength, especially in more nuanced 388 ways than macroscopic associations with force-velocity-power profiles. The performance of the two male 389 athletes that adopted the A-Y strategy, characterised by lead thigh flexion dominant coordination in early flight 390 and shank tuck in step 1 combined with a delayed swing leg recovery in later steps was comparable with that of 391 those exhibiting a B-X strategy (Figure 7). The small number of participants who displayed this approach 392 suggest it is less common, and future work could explore what specific individual constraints might be 393 associated with such an approach as it may be an equally effective strategy as the more common B-X. 394 Comparable performances between B-X and A-Y combinations could potentially indicate degeneracy in these 395 coordination strategies [15]. These strategies only differed in shank-foot coordination, such that the different 396 shank-foot approaches (i.e., high or low foot dominancy) could be equally effective in combination with the 397 same thigh motion and could possibly result from differences in individual anatomy or strength or coaching. It 398 remains to be explored whether potential degeneracy in coordination could relate to degeneracy observed in 399 linear kinematic strategies during initial acceleration [15]. However, while these observations imply the potential 400 for degeneracy in some strategies, in totality, the performance results presented here point toward the existence 401 of coordination strategies associated with higher performance in a sample of well-trained sprinters as well as 402 strategies that are more commonly observed in this population.

403

404 The current study is the first to apply a clustering approach to coordination in sprinting and has provided new 405 insights into the body organisation during initial acceleration. However, there remain several limitations. 406 Hierarchical clustering facilitated the novel identification of initial acceleration coordination strategies, but the 407 identified strategies are not exhaustive, and these patterns may not generalise outside the current population of 408 experienced, high level sprinters. Whilst increasing the sample could also provide a more robust characterisation 409 of the coordination strategies and their effectiveness, this study intentionally focused only on high level sprinters 410 and the current sample is relatively large in comparison with other studies of such populations. Furthermore, the 411 current study included only segment kinematics since data collection took place in an uninvasive manner during 412 real training sessions. The future measurement of external kinetics would enable a direct assessment of the 413 relationships between coordination and force application for each step, as well as additional consideration of

414 joint kinetics that could enhance the understanding of coordination differences between different patterns, 415 especially with regard to the ankle joint during dorsiflexion, given the important power absorption during this 416 period [17, 19].

417

418 For practitioners, the approach applied in the current study highlights the potential to quantitatively profile 419 sprinters such that their individual coordination patterns can be understood in the context of the different 420 available strategies. These results suggest that the pattern of thigh interchange after block clearance and the 421 balance of shank or foot dominance during ankle dorsiflexion appear to be important factors which distinguish 422 the different coordination profiles adopted by sprinters during initial acceleration. Different coordination 423 strategies were also associated with differences in discrete kinematics, particularly at block clearance and 424 touchdown in step 1, suggesting coaches should be mindful of the impact on movement patterns that cues to 425 adopt specific body positions might have.

426

427 The current study has identified distinct technical strategies from lower limb coordination patterns during 428 acceleration. In a sample of highly-trained to world class sprinters, cluster analysis of similar coordination 429 strategies identified three sub-groups of sprinters in the first step and two sub-groups in the subsequent three 430 steps. The results show that, in males, coordination strategies characterised by lead thigh dominant flexion in 431 early flight and greater foot dominant coordination during early stance dorsiflexion in step 1 combined with 432 early swing thigh retraction in later steps was associated with faster times and higher performers. By classifying 433 the coordination strategies used by high-level sprinters during initial acceleration, this study helps to understand 434 the range of approaches available to sprinters and identify the key coordinative features which distinguish 435 different strategies in this population. This aids coaches and researchers in further understanding the technical 436 approaches used by sprinters as well as the coordination of movement between the positions adopted at key 437 events.

- 439 **Funding statement**
- 440
- 441 No external funding was provided for this study.
- 442
- 443 **Disclosure statement**
- 444
- 445 The authors report no conflict of interest.
- 446
- 447
- • •
- 448
- 449

450 References

[1] Morin JB, Edouard P, Samozino P. Technical Ability of Force Application as a Determinant Factor of Sprint
Performance. Medicine & Science in Sports & Exercise. 2011;43(9):1680-8.

454

- 455 [2] Morin JB, Gimenez P, Edouard P, Arnal P, Jiménez-Reyes P, Samozino P, et al. Sprint Acceleration
 456 Mechanics: The Major Role of Hamstrings in Horizontal Force Production. Frontiers in Physiology. 2015 Dec;6.
 457
- 458 [3] von Lieres und Wilkau HC, Irwin G, Bezodis NE, Simpson S, Bezodis IN. Phase Analysis in Maximal
 459 Sprinting: An Investigation of Step-to-Step Technical Changes between the Initial Acceleration, Transition and
 460 Maximal Velocity Phases. Sports Biomechanics. 2018:1-16.
- 461

462 [4] Kugler F, Janshen L. Body Position Determines Propulsive Forces in Accelerated Running. Journal of463 Biomechanics. 2010;43(2):343-8.

464

465 [5] Slawinski J, Bonnefoy A, Levêque JM, Ontanon G, Riquet A, Dumas R, et al. Kinematic and Kinetic
466 Comparisons of Elite and Well-Trained Sprinters During Sprint Start:. Journal of Strength and Conditioning
467 Research. 2010;24(4):896-905.

468

469 [6] McMillan S, Pfaff D. Kinogram Method Ebook. ALTIS; 2018. Available from: https://altis.world/kinogram-470 method-ebook/.

471

472 [7] Bezodis IN, Brazil A, von Lieres und Wilkau HC, Wood MA, Paradisis GP, Hanley B, et al. World-Class
473 Male Sprinters and High Hurdlers Have Similar Start and Initial Acceleration Techniques. Frontiers in Sports
474 and Active Living. 2019;1:23.18

475

476 [8] Okudaira M, Willwacher S, Kawama R, Ota K, Tanigawa S. Sprinting Kinematics and Inter-Limb
477 Coordination Patterns at Varying Slope Inclinations. Journal of Sports Sciences. 2021;0(0):1-10.

478

479 [9] Kimura A, Yokozawa T, Ozaki H. Clarifying the Biomechanical Concept of Coordination Through480 Comparison With Coordination in Motor Control. Frontiers in Sports and Active Living. 2021;3:290.

481

482 [10] Davids K, Glazier P, Araújo D, Bartlett R. Movement Systems as Dynamical Systems. Sports Medicine.
483 2003;33(4):245-60.

- 485 [11] Newell K. Constraints on the Development of Coordination. In: Motor Development in Children : Aspects486 of Coordination and Control. Martinus Nijhoff; 1986. p. 341-60.
- 487

488 [12] Bernstein NA. Co-Ordination and Regulation of Movements. Pergamon Press; 1967.

489

490 [13] Kelso JAS, Schöner G. Self-Organization of Coordinative Movement Patterns. Human Movement Science.491 1988;7(1):27-46.

492

[14] Tononi G, Sporns O, Edelman GM. Measures of Degeneracy and Redundancy in Biological Networks.Proceedings of the National Academy of Science. 1999;96:3257-62.17

495

496 [15] Wild JJ, Bezodis IN, North JS, Bezodis NE. Characterising Initial Sprint Acceleration Strategies Using a
497 Whole-Body Kinematics Approach. Journal of Sports Sciences. 2021:1-12. Available from:
498 <u>https://www.tandfonline.com/doi/full/10</u>. 1080/02640414.2021.1985759.

499

500 [16] Debaere S, Delecluse C, Aerenhouts D, Hagman F, Jonkers I. From Block Clearance to Sprint Running:
501 Characteristics Underlying an Effective Transition. Journal of Sports Sciences. 2013;31(2):137-49.

502

[17] Bezodis NE, Salo AIT, Trewartha G. Lower Limb Joint Kinetics during the First Stance Phase in Athletics
Sprinting: Three Elite Athlete Case Studies. Journal of Sports Sciences. 2014;32(8):738-46.

505

506 [18] Bezodis NE, Salo AIT, Trewartha G. Relationships between Lower-Limb Kinematics and Block Phase
507 Performance in a Cross Section of Sprinters. European Journal of Sport Science. 2015;15(2):118-24.

508

[19] Charalambous L, Irwin G, Bezodis IN, Kerwin D. Lower Limb Joint Kinetics and Ankle Joint Stiffness in
the Sprint Start Push-Off. Journal of Sports Sciences. 2012;30(1):1-9.

511

[20] Brazil A, Exell T, Wilson C, Willwacher S, Bezodis I, Irwin G. Lower Limb Joint Kinetics in the Starting
Blocks and First Stance in Athletic Sprinting. Journal of Sports Sciences. 2016 Sep:1-7.

514

515 [21] Jacobs R, van Ingen Schenau GJ. Intermuscular Coordination in a Sprint Push-Off. Journal of516 Biomechanics. 1992;25(9):953-65.

517

[22] Alt T, Oeppert T, Zedler M, Goldmann JP, Braunstein B, Willwacher S. A novel guideline for the analysis of
linear acceleration mechanics - outlining a conceptual framework of 'shin roll' motion. Sports Biomechanics.
2022.

- 522 [23] Kiely J, Collins DJ. Uniqueness of Human Running Coordination: The Integration of Modern and Ancient 523 Evolutionary Innovations. Frontiers in Psychology. 2016;7. 524 525 [24] Clark KP, Meng CR, Stearne DJ. "Whip from the Hip": Thigh Angular Motion, Ground Contact Mechanics, 526 and Running Speed. Biology Open. 2020:bio.053546. 527 528 [25] Bayne H, Donaldson B, Bezodis N. Inter-Limb Coordination During Sprint Acceleration. ISBS Proceedings 529 Archive. 2020;38(1):448-51. 530 531 [26] Needham RA, Naemi R, Hamill J, Chockalingam N. Analysing Patterns of Coordination and Patterns of 532 Control Using Novel Data Visualisation Techniques in Vector Coding. The Foot. 2020:101678. 533 534 [27] van Oeveren BT, de Ruiter CJ, Beek PJ, van Dieen JH. The Biomechanics of Running and Running Styles: 535 A Synthesis. Sports Biomechanics. 2021 Mar:1-39. 536 537 [28] Donaldson BJ, Bezodis NE, Bayne H. Inter- and Intra-Limb Coordination during Initial Sprint Acceleration. 538 Biology Open. 2022;11(10):bio059501. 539 540 [29] McKay AKA, Stellingwerff T, Smith ES, Martin DT, Mujika I, Goosey-Tolfrey VL, et al. Defining Training
- 541 and Performance Caliber: A Participant Classification Framework. International Journal of Sports Physiology 542 and Performance. 2021:1-15.

543

- 544 [30] Berner K, Cockcroft J, Morris LD, Louw Q. Concurrent Validity and Within-Session Reliability of Gait 545 Kinematics Measured Using an Inertial Motion Capture System with Repeated Calibration. Journal of Bodywork 546 and Movement Therapies. 2020;24(4):251-60.
- 547
- 548 [31] Cottam, D. S., Campbell, A. C., Davey, M. P. C., Kent, P., Elliott, B. C. and Alderson, J. A., Measurement 549 of uni-planar and sport specific trunk motion using magneto-inertial measurement units: The concurrent validity 550 of Noraxon and Xsens systems relative to a retro-reflective system, Gait & Posture. 2022; 92, 129–134.
- 551
- 552 [32] Balasubramanian, S. Comparison of Angle Measurements between Vicon and MyoMotion Systems, PhD 553 thesis, Arizona State University; 2013.
- 554

555 [33] Yoon, T.-L. Validity and Reliability of an Inertial Measurement Unit-Based 3D Angular Measurement of 556 Shoulder Joint Motion. The Journal of Korean Physical Therapy. 2017; 29(3), 145–151.

- 557
- 558 [34] Donaldson B, Bezodis N, Bayne H. Within-Subject Repeatability and between Subject Variability in Posture 559 during Calibration of an Inertial Measurement Unit System. ISBS Proceedings Archive. 2021;39(1):4. 560 561 [35] Samozino P, Rabita G, Dorel S, Slawinski J, Pevrot N, de Villarreal ESS, et al. A Simple Method for 562 Measuring Power, Force, Velocity Properties, and Mechanical Effectiveness in Sprint Running. Scandinavian 563 Journal of Medicine & Science in Sports. 2016;26(6):648-58. 564 565 [36] Morin JB, Samozino P, Murata M, Cross MR, Nagahara R. A Simple Method for Computing Sprint 566 Acceleration Kinetics from Running Velocity Data: Replication Study with Improved Design. Journal of 567 Biomechanics. 2019 Sep;94:82-7. 568 569 [37] Jovanović M. shorts: Short Sprints; 2020. R package version 1.1.4. 570 571 [38] Chang R, Van Emmerik R, Hamill J. Quantifying Rearfoot–Forefoot Coordination in Human Walking. 572 Journal of Biomechanics. 2008;41(14):3101-5. 573 574 [39] Donaldson B, Bezodis N, Bayne H. Similarity of Coordination Patterns in a Group of Highly Trained 575 Sprinters: A Novel Approach. ISBS Proceedings Archive. 2022;40(1):4. 576 577 [40] Nagahara R, Matsubayashi T, Matsuo A, Zushi K. Kinematics of Transition during Human Accelerated 578 Sprinting. Biology Open. 2014;3(8):689-99. 19 579 580 [41] Jones R, Bezodis I, Thompson A. Coaching Sprinting: Expert Coaches' Perception of Race Phases and 581 Technical Constructs. International Journal of Sports Science & Coaching. 2009;4(3):385-96. 582 583 [42] Hair JF, Anderson RE, Babin BJ, Black WC. Multivariate Data Analysis. Seventh ed. London: Prentice 584 Hall; 2009. 585 586 [43] Sarvestan J, Svoboda Z, Baeyens JP, Serrien B. Whole Body Coordination Patterning in Volleyball Spikes 587 under Various Task Constraints: Exploratory Cluster Analysis Based on Self-Organising Maps. Sports 588 Biomechanics. 2020 Aug:1-15. 589 590 [44] Phinyomark A, Osis S, Hettinga BA, Ferber R. Kinematic Gait Patterns in Healthy Runners: A Hierarchical 591 Cluster Analysis. Journal of Biomechanics. 2015 Nov;48(14):3897-904.
- 592

- 593 [45] Nielsen F. Hierarchical Clustering. In: Nielsen F, editor. Introduction to HPC with MPI for Data Science.
- 594 Undergraduate Topics in Computer Science. Cham: Springer International Publishing; 2016. p. 195-211.

[46] R Core Team. R: A Language and Environment for Statistical Computing. Vienna, Austria; 2020.

- [47] Kassambara A. rstatix: Pipe-Friendly Framework for Basic Statistical Tests; 2021. R package version 0.7.0.
- 600 [48] Wild JJ, Bezodis IN, North JS, Bezodis NE. Differences in Step Characteristics and Linear Kinematics601 between Rugby Players and Sprinters during Initial Sprint Acceleration. European Journal of Sport Science.
- 602 2018 Nov;18(10):1327-37.20
 - 603
 - 604
 - 605
 - 606
 - 607