

This is an Accepted Manuscript version of the following article, accepted for publication in Journal of Sports Sciences Armitage, M. Beato, M. Mcerlain-Naylor, S. Inter-unit reliability of IMU Step metrics using IMeasureU Blue Trident inertial measurement units for running-based team sport tasks. It is deposited under the terms of the Creative Commons Attribution-NonCommercial-NoDerivatives License (<http://creativecommons.org/licenses/by-nc-nd/4.0/>), which permits non-commercial re-use, distribution, and reproduction in any medium, provided the original work is properly cited, and is not altered, transformed, or built upon in any way. The final published version is available here: <https://www.tandfonline.com/doi/abs/10.1080/02640414.2021.1882726?journalCode=rjsp20>

1 **INTER-UNIT RELIABILITY OF IMU STEP METRICS USING IMEASUREU BLUE**
2 **TRIDENT INERTIAL MEASUREMENT UNITS FOR RUNNING-BASED TEAM**
3 **SPORT TASKS**

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9 SHORT TITLE – INTER-UNIT RELIABILITY OF IMU STEP METRICS

10

11 Original investigation

12 Abstract: *176 words*

13 Manuscript: *3507 words*

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26 **INTER-UNIT RELIABILITY OF IMU STEP METRICS USING IMEASUREU BLUE**
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29

30 **ABSTRACT**

31 The aim of this study was to determine the inter-unit reliability of IMU Step biomechanical
32 load monitoring metrics using IMeasureU Blue Trident inertial measurement units in tasks
33 common to running-based team sports. Knowledge of variability between units is required
34 before researchers and practitioners can make informed decisions on ‘true’ differences between
35 limbs. Sixteen male college soccer players performed five running-based tasks, generating 224
36 trials and 17012 steps. Data were analysed for each task and for the whole session, investigating
37 six IMU Step metrics: step count; impact load; bone stimulus; and low, medium and high
38 intensity steps. Inter-unit reliability was *excellent* ($ICC \geq 0.90$) for 21 out of 26 metrics, and
39 *good* ($0.83 \leq ICC \leq 0.86$) for all other metrics except for Yo-Yo impact load ($ICC = 0.79$) which
40 was *acceptable*. These findings confirm the inter-unit reliability of IMU Step metrics using
41 IMeasureU Blue Trident inertial measurement units for running-based team sports. Now that
42 inter-unit variability has been quantified, researchers and practitioners can use this information
43 when interpreting inter-limb differences for monitoring external biomechanical training load.

44

45 Keywords: accelerometer, bone stimulus, tibial acceleration, impact load, training load

46 INTRODUCTION

47 The term training load is common in both research and applied sport settings and is categorised
48 as internal or external load (Impellizzeri et al., 2019). Internal load describes the body's
49 response to the external activities performed (Cardinale & Varley, 2017). Traditionally,
50 adaptations to training load have been quantified in relation to physiological stress
51 (Vanrenterghem et al., 2017). However, mechanical stress also contributes to load-adaptation
52 pathways and so training load should be considered from a physiological and biomechanical
53 perspective (Vanrenterghem et al., 2017). To infer decisions from different forms of loading
54 (*e.g.* internal/external, physiological/biomechanical) practitioners typically use a combined
55 approach (Delaney et al., 2018). Global position systems (GPS) have become extremely popular
56 tools to monitor external physiological load (*e.g.* distance covered and speed thresholds) in
57 running-based team sports (Burgess, 2017). Many GPS providers also integrate tri-axial
58 accelerometers into their units creating acceleration derived metrics (*e.g.* PlayerLoad™ and
59 Dynamic Stress Load) to estimate external biomechanical load (Beato et al., 2019; Verheul et
60 al., 2020). The ability of tri-axial accelerometers within scapulae worn GPS units to capture
61 accurate whole-body accelerations (*i.e.* external biomechanical load) has been questioned
62 (Delaney et al., 2019). Recent evidence suggests a need to measure segmental accelerations
63 closest to the position of interest (Greig et al., 2018; Nedergaard et al., 2017; Sheerin et al.,
64 2019), with shank mounted accelerometry increasing in popularity for field-based tibial loading
65 measures (Rice et al., 2018; Verheul et al., 2020; Willy, 2018).

66

67 The relationship between measured segmental accelerations and whole-body biomechanical
68 loading is influenced by factors including the kinematics of the lower limbs at initial foot-
69 ground-contact and acceleration attenuation between body segments (Nedergaard et al., 2017).
70 Scapulae worn accelerometers may be oversensitive to upper body kinematics (Barrett et al.,

71 2016), and could be distorted by the typical positioning within an elasticated harness (Edwards
72 et al., 2019). Skin mounted tibial accelerometers are commonly used as a proxy for the impact
73 experienced at the tibia (Sheerin et al., 2019) and are sensitive to changes in running speed
74 (Sheerin et al., 2017), technique (Crowell & Davis, 2011), and ground reaction force loading
75 rate (Tenforde et al., 2020). Tibial accelerometry is presently limited to surface acceleration
76 (Vigotsky et al., 2019) and will remain a measure of external, rather than internal, load unless
77 muscle forces are considered (Matijevich et al., 2019). Nonetheless, tibial accelerations have
78 been used to aid clinical assessments of field-based rehabilitation amongst soccer players
79 (Greig et al., 2018), modify running technique post-injury (Creaby & Franettovich Smith,
80 2016), and predict bone-stress injury in runners (Milner et al., 2006). Despite a large body of
81 evidence using shank mounted accelerometry for field-based tibial loading measurement (Rice
82 et al., 2018; Verheul et al., 2020; Willy, 2018), there is limited evidence regarding the reliability
83 of such devices (Sheerin et al., 2019). While laboratory-grade accelerometers are attractive for
84 data-driven insights, automatically generated metrics are required to meet the rapid data
85 processing and output needs of clinicians and coaches (Davis & Gruber, 2019).

86
87 IMU Step combines tri-axial tibial accelerometer units (IMeasureU Blue Trident) with
88 associated data processing (IMU Step dashboard) to provide automatically generated external
89 biomechanical load metrics of step count, impact load, bone stimulus, and number of low,
90 medium and high intensity steps. Bone stimulus is an exponentially weighted metric to model
91 tibial response to cyclic mechanical loading. Based on previous research (Ahola et al., 2010;
92 Beaupré et al., 1990) it incorporates both the number of cycles and load magnitude, being more
93 sensitive to the latter (Besier, 2019). Impact load is the sum of the peak resultant acceleration
94 in g from each step and is therefore directly proportional to the number and intensity of impacts.

95

96 Research using a previous IMeasureU unit model (Blue Thunder) demonstrated reliability of
97 step peak resultant acceleration during treadmill running at different speeds at one week (90%
98 CI: 0.90 – 0.96 ICC, *excellent*) and six month (0.89 – 0.95 ICC, *excellent*) (Sheerin et al., 2017)
99 intervals. Recently, Burland et al. (2020) added to this using newer Blue Trident units and
100 reported inter-session reliability for impact load (95% CI; 0.58 – 0.89 ICC, *fair to excellent*)
101 and bone stimulus (0.90 – 0.97 ICC, *excellent*) metrics across three repeated sessions of sport-
102 specific tasks. Furthermore, they analysed unilateral step counts reporting reliability outputs for
103 acceleration-deceleration (0.73 – 0.84 ICC, *good to excellent*), change of direction (0.73 – 0.96
104 ICC, *good to excellent*) and cutting (0.70 – 0.87 ICC, *good to excellent*) tasks. Reliability values
105 were lowest for the kicking task (0.59 – 0.68 ICC, *fair to good*), attributed to the inherent
106 variability associated with this task.

107

108 Whilst these findings offer researchers and practitioners information regarding the reliability of
109 IMU Step metrics across repeated sessions, differences in sensitivity between each capacitive
110 based microelectromechanical systems unit may lead to inter-unit differences in measured
111 accelerations and automatically generated metrics. Before inter-limb, and thus inter-unit,
112 comparisons can be made, agreement between units must first be ascertained. For differences
113 in inter-limb variation to be confidently interpreted as ‘real’ they must be greater than the
114 known inter-unit coefficient of variation for that metric (Bishop, 2020). Furthermore, the
115 reliability of low, medium and high intensity steps are yet to be investigated, as is reliability of
116 any of these metrics when using the manufacturer’s provided straps. This is especially
117 important given the effect of attachment method on measured tibial accelerations (Sheerin et
118 al., 2019) and the likelihood of practitioners using the provided and recommended attachments.

119

120 The aim of this study was therefore to determine the inter-unit reliability of IMU Step metrics
121 (step count; impact load; bone stimulus; and low, medium and high intensity steps) during tasks
122 common to running-based team sports. It was hypothesised that all metrics would demonstrate
123 *good* or better inter-unit reliability.

124

125 **MATERIALS AND METHODS**

126 *Participants*

127 Sixteen male full-time college soccer academy players participated in this study (age 17 ± 1
128 years; mass 68.5 ± 10.4 kg; height 1.78 ± 0.06 m). Signed informed consent was given by each
129 participant independently (age ≥ 18 years) or via ascent with parent / guardian support (age $<$
130 18 years). The study was performed in accordance with the Declaration of Helsinki for the study
131 of human subjects and was approved by the institutional ethics board of the University of
132 Suffolk (UK).

133

134 *Data Collection*

135 Data were collected using IMeasureU Blue Trident inertial measurement units (Vicon Motion
136 Systems Ltd, Oxford, UK). Each unit (42 x 27 x 11 mm, 9.5 grams) incorporates two tri-axial
137 accelerometers: one with a range of ± 16 g (1125 Hz; 16 bit resolution) to provide resolution at
138 lower accelerations; and one with a range of ± 200 g (1600 Hz; 13 bit resolution) which is used
139 when the first accelerometer's range is exceeded. Two IMeasureU Blue Trident units were
140 affixed to the right distal anteromedial shank of each participant using the provided
141 manufacturer's straps, ensuring a tight but comfortable fit (Rice et al., 2018). The first unit was
142 positioned 20 mm proximal to the superior aspect of the medial malleolus, the mean of two
143 previously reported positions (Rice et al., 2018; Sheerin et al., 2020). The second unit was

144 placed superior to the first unit (Figure 1), positioned as close as possible without causing inter-
145 unit contact during the tasks. Units were randomly allocated.

146

147 *****Figure 1 here please*****

148

149 Data were collected in an indoor hall to standardise environmental conditions. Participants
150 completed five tasks (Figure 2) designed to replicate actions common to running-based team
151 sports. The testing session was repeated back-to-back with three different groups (n = 6, 5, 5).
152 Each session began with the same standardised warm-up, led by an accredited Strength and
153 Conditioning Coach (UKSCA; >10 years of experience). Units were worn throughout the
154 warm-up for familiarisation, but the warm-up data were not analysed.

155

156 *****Figure 2 here please*****

157

158 *Sport-specific tasks*

159 Submaximal intermittent running was achieved through a modified Yo-Yo Intermittent
160 Recovery Test Level 2 (Task 1). Participants were instructed to run back and forth between two
161 cones 18 m apart (modified from the typical 20 m to ensure a submaximal nature) and then
162 walk around a cone 5 m away in time with an audio ‘bleep’. The activity started at Level 13
163 and was terminated after 4 min (Veugelers et al., 2016). Sport-specific tasks were adapted from
164 previous work which investigated other wearable technologies for running-based team sport
165 tasks (Luteberget et al., 2018; Roell et al., 2019). Participants were asked to perform each sport-
166 specific task maximally and rested for 1 min between trials and 3 min between tasks (Figure
167 3). Before and after each trial of each task, participants stood stationary for ~ 5 s, which in
168 addition to the required rest periods facilitated extraction of data (*i.e.* a clear start and end point).

169

170

Figure 3 here please

171

172 Task 2 involved three trials of straight-line sprinting with a 7 m linear acceleration and 3 m
173 deceleration zone (Figure 2). Task 3 (V-Drill) required participants to run 2.5 m from the start
174 position at an angle of 37.5° from the forward direction on their right-hand-side and then
175 backwards to the start, before immediately repeating on the left. Participants completed two
176 trials on each side. Task 4 was achieved by a 6 m straight-line sprint, a 90° cut, 2 m acceleration
177 to a cone and 2 m deceleration to the next cone. Participants completed two trials to the left and
178 two to the right. Task 5 was a Zig-Zag running circuit consisting of two 60° cuts alternatively
179 to left and right before arriving at the stop gate. Participants completed two trials.

180

181 *Data Processing*

182 All data were captured in real-time using the manufacturer's IOS application (app version
183 2.7.523). All acceleration data were downloaded after data collection using IMU Step software
184 version 2.7.1, with footnotes added retrospectively to identify each drill. Metrics were output
185 for all individual tasks (including inter-trial rest periods) and for the entire session (including
186 all rest periods). The IMU Step software outputs the automatically generated metrics of step
187 count, impact load, bone stimulus, and number of low (LIS: default threshold of peak resultant
188 tibial acceleration ≤ 6 g), medium ($6 \text{ g} < \text{MIS} \leq 21.5$ g) and high ($\text{HIS} > 21.5$ g) intensity steps.
189 Data from the two units per participant were randomly allocated as either unit one or unit two
190 for subsequent statistical analysis.

191

192 *Statistical Analysis*

193 All statistical analysis was performed using JASP (Amsterdam, Netherlands) software version
194 0.9.2. All descriptive data were presented as mean \pm standard deviation (SD). Normality of
195 distributions were assessed by Shapiro-Wilk test ($0.074 \leq p \leq 0.998$). Inter-unit reliability was
196 assessed for all task-metric combinations containing an average of ≥ 20 steps per participant.
197 Inter-unit reliability was calculated by two-way mixed model intra-class correlation coefficient
198 (ICC), interpreted as: *excellent* ≥ 0.9 ; $0.9 > \textit{good} \geq 0.8$; $0.8 > \textit{acceptable} \geq 0.7$; $0.7 >$
199 *questionable* ≥ 0.6 ; $0.6 > \textit{poor} \geq 0.5$; *unacceptable* < 0.5 (Atkinson & Nevill, 1998). Technical
200 error of measurement (TE) was calculated as $SD \cdot \sqrt{(1-ICC)}$ (Hopkins et al., 2001). Confidence
201 intervals (CI) at 95% were reported. TE was reported as coefficient of variation (CV),
202 considered as: *good* $< 10\%$; $10\% \leq \textit{questionable} \leq 15\%$; *poor* $> 15\%$ (Cormack et al., 2008).

203

204 RESULTS

205 On average participants performed 530 steps of which 56 ± 5 , 19 ± 4 and $24 \pm 5\%$ were LIS,
206 MIS and HIS respectively. The Yo-Yo contributed the most steps across all bands with the
207 remaining four tasks being relatively comparable (Table I). Inter-unit reliability was *excellent*
208 ($0.90 \leq ICC \leq 0.98$) for most metrics (21 out of 26), including all step count, LIS, HIS and bone
209 stimulus metrics (Table II). Inter-unit reliability was *good* ($0.83 \leq ICC \leq 0.86$) for all other
210 metrics except for Yo-Yo impact load ($ICC = 0.79$; $CI: 0.40, 0.93$) which was *acceptable*. TE
211 (CV%) was *good* ($0.7\% \leq TE \leq 9.7\%$) for all metrics assessed except for impact load during
212 the overall session, Yo-Yo, sprint and Zig-Zag tasks which were *questionable* (10.8 – 14.5 %)
213 (Table III).

214

215 ***Tables I - III here please***

216

217 **DISCUSSION**

218 The aim of this study was to determine the inter-unit reliability of IMU Step metrics (step count;
219 impact load; bone stimulus; and low, medium and high intensity steps) during tasks common
220 to running-based team sports. In accordance with the hypothesis, all task-metric combinations
221 displayed *good* or *excellent* ICC except for Yo-Yo impact load which was *acceptable*. Most
222 metrics (22 out of 26) displayed *good* CV, although impact load was *questionable* for the whole
223 session, Yo-Yo, sprint and Zig-Zag tasks.

224

225 The present findings are comparable to previous research which reported reliability (0.89 – 0.96
226 ICC, *excellent*) for step peak resultant acceleration during treadmill running in a laboratory
227 using earlier model IMeasureU Blue Thunder units (Sheerin et al., 2017). This study however,
228 adds new IMU Step metrics, utilises updated IMeasureU Blue Trident units and involves tasks
229 more common to team-based running sports in agreement with Burland et al. (2020).
230 Combining the results of this study (inter-unit reliability) with those of Burland et al. (2020)
231 (inter-session reliability) researchers and practitioners can have greater confidence when
232 assessing step frequency, magnitude and symmetry to evaluate training load. The ICC values
233 for running-based tasks were comparable or greater in the current study compared to Burland
234 *et al.* (2020) for impact load (0.79 – 0.96 vs 0.75 – 0.89) and step count (0.91 - 0.98 vs 0.70 –
235 0.96). As mentioned by Burland *et al.* (2020), the reliability of each measure is a function of
236 hardware reliability and movement consistency. Consistency of movement will be greater in a
237 single trial compared to repeated session designs, perhaps providing a better measure of
238 hardware reliability. Furthermore, whilst Burland *et al.* (2020) analysed unilateral steps by
239 placing a unit on each tibia (in accordance with manufacturer’s recommendations), any
240 differences between units were not known. Thus, in addition to inter-session reliability,
241 researchers and practitioners can now be confident that there is little difference between units

242 (inter-unit reliability) in metrics derived from IMU Step software. This finding could have large
243 potential implications for inferring differences in limb loading when evaluating training load.
244
245 Similarly to previous inter-session measures (Burland et al., 2020) bone stimulus reported the
246 greatest inter-unit reliability of all IMU Step metrics. Due to its cumulative nature this metric
247 considers all preceding impacts and so represents the entire session up to that time point. It is
248 unable to differentiate between separate tasks within a session because individual tasks are
249 dependent upon earlier loading cycles. Based on bone mechanobiology (Ahola et al., 2010;
250 Beaupré et al., 1990; Besier, 2019), bone stimulus is intended to predict the mechanical stimulus
251 responsible for bone remodelling which plateaus with repeated cycles (Besier, 2019). This
252 results in a large increase during the first activity and continued rise with additional tasks,
253 resulting in an overall value which is matched by the last task. The linear impact load metric
254 provides greater indicative insights within sessions because it is calculated by summing the
255 peak acceleration of each step (*e.g.* number of steps x 1 g + number of steps x 2 g + . . . number
256 of steps x *n* g). It is therefore unaffected by loading earlier in the session and so can be split to
257 enable task level analysis. Greater impact loads are caused by either higher magnitude impacts
258 and/or a greater number of impacts. In this study, impact load demonstrated *acceptable* to
259 *excellent* (0.79 – 0.96) ICC and *questionable* to *good* (7.9 – 14.5%) CV which was lower than
260 other metrics. To investigate between-device agreement units were positioned as close as
261 possible without causing contact, to limit a known attenuation effect along the tibia (Lucas-
262 Cuevas et al., 2017). Any attenuation of acceleration signals between the two units would
263 logically have the greatest effect on impact load metrics. Whilst other metrics count impacts
264 (*e.g.* step count), categorise impacts into large ordinal ‘bins’ (*e.g.* LIS, MIS and HIS), or plateau
265 with increasing load (*e.g.* bone stimulus), impact load is sensitive to small differences in peak
266 resultant accelerations which are summed each step and thus more prone to error. It was not

267 possible to place both units in exactly the same position on the tibia, although such a true
268 measure of inter-unit reliability would likely result in greater ICC and lower CV values than
269 those reported in the present study due to the removal of signal attenuation artefacts.

270

271 This study is the first to report reliability data for the automatically ‘binned’ IMU Step metrics
272 describing step intensity. Reliability was *excellent* for LIS (0.95 ICC), MIS (0.94 ICC) and HIS
273 (0.96 ICC) during the Yo-Yo task, and *good* to *excellent* for the session overall (LIS 0.95,
274 *excellent*; MIS 0.86, *good*; HIS 0.96, *excellent*). The lower ICC value for MIS overall may be
275 partly explained by the selected tasks facilitating more LIS and HIS. Nevertheless, these
276 findings suggest that as well as low magnitude accelerations, IMU Step is reliable for measuring
277 medium and higher magnitude (> 6 g) intermittent acceleration and deceleration activities.
278 Future research should confirm this finding during discrete high acceleration tasks (*e.g.*
279 sprinting, cutting and changing direction) for which the MIS and HIS step counts in the present
280 study were insufficient to enable task level analysis other than for the Yo-Yo.

281

282 Researchers and practitioners can be confident that there is little variation between IMeasureU
283 Blue Trident units in metrics derived from IMU Step software. As such inter-limb comparisons,
284 using automatically generated metrics as arbitrary measures (Hughes et al., 2019), can now be
285 considered. Researchers and practitioners can make decisions regarding inter-limb asymmetry
286 in direct relation to the presently reported magnitudes of inter-unit reliability. Specifically,
287 inter-limb variation in IMU Step metrics should only be considered indicative of asymmetry if
288 they are greater than the reported inter-unit CV for that metric (Bishop, 2020). Future research
289 should establish what magnitude of asymmetry, beyond the now known inter-unit variation,
290 could be deemed clinically meaningful (Harrison et al., 2020).

291

292 The reliability found in this study is similar to those reported for back-worn GPS embedded
293 accelerometers using a similar protocol (Roell et al., 2019). However, GPS units worn at the
294 torso only provide an indirect measure of the mechanical loads experienced at the lower limbs
295 (Glassbrook et al., 2020). *Poor to questionable* reliability and high variability has been reported
296 when comparing trunk worn GPS accelerometers to laboratory methods (Edwards et al., 2019).
297 Differences between systems should be expected due to variations in unit location and
298 specification such as capture frequency, sensitivity, or resolution (Edwards et al., 2019;
299 Glassbrook et al., 2020). GPS-integrated tri-axial accelerometers typically capture data at 100
300 Hz (Malone et al., 2017) with laboratory-grade accelerometers and IMeasureU units (1125 to
301 1600 Hz) possessing higher sampling frequencies (Sheerin et al., 2019). The combined use of
302 both technologies could give greater insights into training load management (*e.g.* asymmetry
303 in impact load reported within specific ranges of running speeds in representative sporting
304 environments), compared to using each technology independently (Glassbrook et al., 2020).

305
306 In this study, data were automatically processed within the manufacturer's IMU Step software
307 to investigate the entire biomechanical load monitoring system (hardware + software) and
308 enhance applicability to researchers and practitioners using automated outputs. The calculation
309 of metrics based on peak resultant acceleration per step were explained previously, whereas
310 processing of raw acceleration signals prior to extraction of peak values (*e.g.* the filtering
311 method used) are unknown and may be explored as part of future validation research. IMU Step
312 enables the user to export raw acceleration data, which might further enhance reliability through
313 manual processing and selection of filters or 'intensity' thresholds (Malone et al., 2017). Any
314 effects of high-frequency noise or filter selection will be included within the present inter-unit
315 reliability analysis. Likewise, whilst damping effects of footwear are unlikely to have affected
316 the within-limb comparisons, standardised footwear may be considered within future research

317 designs. Now that favourable inter-unit reliability has been reported for automated metrics
318 derived by IMU Step software using IMeasureU Blue Trident inertial measurement units,
319 research establishing the validity of these metrics is necessary. If validated, they could provide
320 researchers and practitioners with useful insights into external biomechanical training load.
321 Whilst the reliable bone stimulus metric is based upon the mechanobiology of bone response
322 to loading (Ahola et al., 2010; Beaupré et al., 1990), information regarding muscle activation
323 will be necessary to model the adaptation of muscle and tendon to their mechanical environment
324 (Young et al., 2016).

325

326 **CONCLUSION**

327 IMU Step is a biomechanical load monitoring system that uses tri-axial tibial accelerometer
328 units on each leg to support in the quantification of lower limb loading in the field through
329 automatically generated metrics (step count; impact load; bone stimulus; and low, medium and
330 high intensity steps). Knowledge of agreement between units was required to enable researchers
331 and practitioners to make informed decisions on differences between limbs. This study is the
332 first to report such data. All task-metric combinations displayed *good* or *excellent* intra-class
333 correlation coefficient, except for Yo-Yo impact load which was *acceptable*. Most metrics (22
334 out of 26) displayed *good* coefficient of variation, although impact load was *questionable* for
335 the whole session, Yo-Yo, sprint and Zig-Zag tasks. These findings confirm the inter-unit
336 reliability of IMU Step metrics for running-based team sports. Inter-unit and hence inter-limb
337 comparisons can now be made with reference to known levels of inter-unit reliability.

338

339 **ACKNOWLEDGEMENTS**

340 None

341

342 **DECLARATION OF INTEREST STATEMENT**

343 The authors report no conflicts of interest

344

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489 Table I. Mean \pm SD IMU Step metric values for steps performed throughout the data collection session (overall) and during sport-specific tasks (n
 490 = 16 players, 224 trials).
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Tasks	SC ₁ and SC ₂	LIS ₁ and LIS ₂	MIS ₁ and MIS ₂	HIS ₁ and HIS ₂	IL ₁ and IL ₂	BS ₁ and BS ₂
Overall	534 \pm 52	300 \pm 38	102 \pm 21	131 \pm 35	7265 \pm 2020	235 \pm 9
	529 \pm 44	301 \pm 33	97 \pm 18	130 \pm 29	7086 \pm 1668	235 \pm 8
Yo-Yo	235 \pm 15	74 \pm 13	75 \pm 22	86 \pm 26	4487 \pm 1419	N/A
	235 \pm 14	76 \pm 11	74 \pm 21	84 \pm 22	4280 \pm 941	
Sprint	58 \pm 15	49 \pm 15	3 \pm 2	6 \pm 1	392 \pm 138	N/A
	57 \pm 13	49 \pm 13	3 \pm 2	5 \pm 2	424 \pm 171	
V-Drill	46 \pm 7	29 \pm 6	6 \pm 3	11 \pm 3	536 \pm 125	N/A
	44 \pm 7	27 \pm 6	7 \pm 4	9 \pm 3	550 \pm 168	
90L	30 \pm 5	23 \pm 4	2 \pm 2	5 \pm 1	324 \pm 128	N/A
	31 \pm 5	24 \pm 4	2 \pm 2	5 \pm 2	332 \pm 125	
90R	33 \pm 8	26 \pm 8	3 \pm 2	5 \pm 2	283 \pm 137	N/A
	33 \pm 8	26 \pm 7	5 \pm 2	4 \pm 1	287 \pm 125	
Zig-Zag	42 \pm 9	25 \pm 7	6 \pm 4	11 \pm 4	592 \pm 179	N/A
	40 \pm 7	24 \pm 6	5 \pm 3	11 \pm 3	574 \pm 155	

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 493 SC = step count, LIS = low intensity steps, MIS = medium intensity steps, HIS = high intensity steps, IL = impact load, BS = bone stimulus, SD =
 494 standard deviation, ₁ & ₂ = the randomly allocated unit 1 and unit 2. Note: BS is a metric for assessing entire sessions only.

495 Table II. IMU Step inter-unit (IMeasureU Blue Trident) reliability as calculated by intra-class coefficient (ICC) for steps performed throughout the
 496 data collection session (overall) and during sport-specific tasks (n = 16 players, 224 trials).

Tasks	SC	LIS	MIS	HIS	IL	BS
	ICC (95% CI)	ICC (95% CI)	ICC (95% CI)	ICC (95% CI)	ICC (95% CI)	ICC (95% CI)
	<i>interpretation</i>	<i>interpretation</i>	<i>interpretation</i>	<i>interpretation</i>	<i>Interpretation</i>	<i>interpretation</i>
Overall	0.96 (0.90, 0.99) <i>excellent</i>	0.95 (0.86, 0.98) <i>excellent</i>	0.86 (0.60, 0.95) <i>good</i>	0.96 (0.88, 0.98) <i>excellent</i>	0.85 (0.57, 0.95) <i>good</i>	0.97 (0.92, 0.99) <i>excellent</i>
Yo-Yo	0.91 (0.74, 0.96) <i>excellent</i>	0.95 (0.87, 0.98) <i>excellent</i>	0.94 (0.83, 0.98) <i>excellent</i>	0.96 (0.89, 0.99) <i>excellent</i>	0.79 (0.40, 0.93) <i>acceptable</i>	N/A
Sprint	0.98 (0.93, 0.99) <i>excellent</i>	0.97 (0.92, 0.99) <i>excellent</i>	Not calculated	Not calculated	0.90 (0.72, 0.97) <i>excellent</i>	N/A
V-Drill	0.98 (0.94, 0.99) <i>excellent</i>	0.98 (0.95, 0.99) <i>excellent</i>	Not calculated	Not calculated	0.83 (0.51, 0.94) <i>good</i>	N/A
90L	0.94 (0.83, 0.98) <i>excellent</i>	0.94 (0.82, 0.97) <i>excellent</i>	Not calculated	Not calculated	0.96 (0.91, 0.99) <i>excellent</i>	N/A
90R	0.98 (0.95, 0.99) <i>excellent</i>	0.98 (0.96, 0.99) <i>excellent</i>	Not calculated	Not calculated	0.96 (0.90, 0.98) <i>excellent</i>	N/A
Zig-Zag	0.95 (0.88, 0.98) <i>excellent</i>	0.97 (0.92, 0.99) <i>excellent</i>	Not calculated	Not calculated	0.84 (0.55, 0.94) <i>good</i>	N/A

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498 SC = step count, LIS = low intensity steps, MIS = medium intensity steps, HIS = high intensity steps, IL = impact load, BS = bone stimulus,
 499 CI = confidence interval. Note: BS is a metric for assessing entire sessions only. Inter-unit reliability was assessed for all task-metric combinations
 500 containing an average of ≥ 20 steps per participant (Table 1).

501 Table III. IMU Step inter-unit (IMeasureU Blue Trident) reliability as calculated by technical error of measurement (TE) and coefficient of variation
 502 (CV) for steps performed throughout the data collection session (overall) and during sport-specific tasks (n = 16 players, 224 trials).

Variables	SC	LIS	MIS	HIS	IL	BS
	TE (CV%)	TE (CV%)	TE (CV%)	TE (CV%)	TE (CV%)	TE (CV%)
	<i>interpretation</i>	<i>interpretation</i>	<i>interpretation</i>	<i>interpretation</i>	<i>interpretation</i>	<i>interpretation</i>
Overall	10.4 (1.9%) <i>good</i>	8.5 (2.8%) <i>good</i>	7.9 (7.7%) <i>good</i>	7.0 (5.3%) <i>good</i>	782 (10.8%) <i>questionable</i>	1.6 (0.7%) <i>good</i>
Yo-yo	4.5 (1.9%) <i>good</i>	2.9 (3.9%) <i>good</i>	5.4 (7.2%) <i>good</i>	5.2 (6.0%) <i>good</i>	650 (14.5%) <i>questionable</i>	N/A
Sprint	2.1 (3.7%) <i>good</i>	2.6 (5.3%) <i>good</i>	Not calculated	Not calculated	43.6 (11.1%) <i>questionable</i>	N/A
Vdrill	1.0 (2.2%) <i>good</i>	0.8 (2.9%) <i>good</i>	Not calculated	Not calculated	51 (9.6%) <i>good</i>	N/A
90L	1.2 (4.1%) <i>good</i>	1.0 (4.3%) <i>good</i>	Not calculated	Not calculated	25 (7.9%) <i>good</i>	N/A
90R	1.1 (3.4%) <i>good</i>	1.1 (4.4%) <i>good</i>	Not calculated	Not calculated	27 (9.7%) <i>good</i>	N/A
Zig-Zag	2.0 (4.8%) <i>good</i>	1.2 (4.8%) <i>good</i>	Not calculated	Not calculated	71 (12.1%) <i>questionable</i>	N/A

503 SC = step count, LIS = low intensity steps, MIS = medium intensity steps, HIS = high intensity steps, IL = impact load, BS = bone stimulus.

504 Note: BS is a metric for assessing entire sessions only. Inter-unit reliability was assessed for all task-metric combinations containing an average of
 505 ≥ 20 steps per participant (Table 1).

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508 *Figure 1 – positioning of IMeasureU Blue Trident sensors on the right shank*

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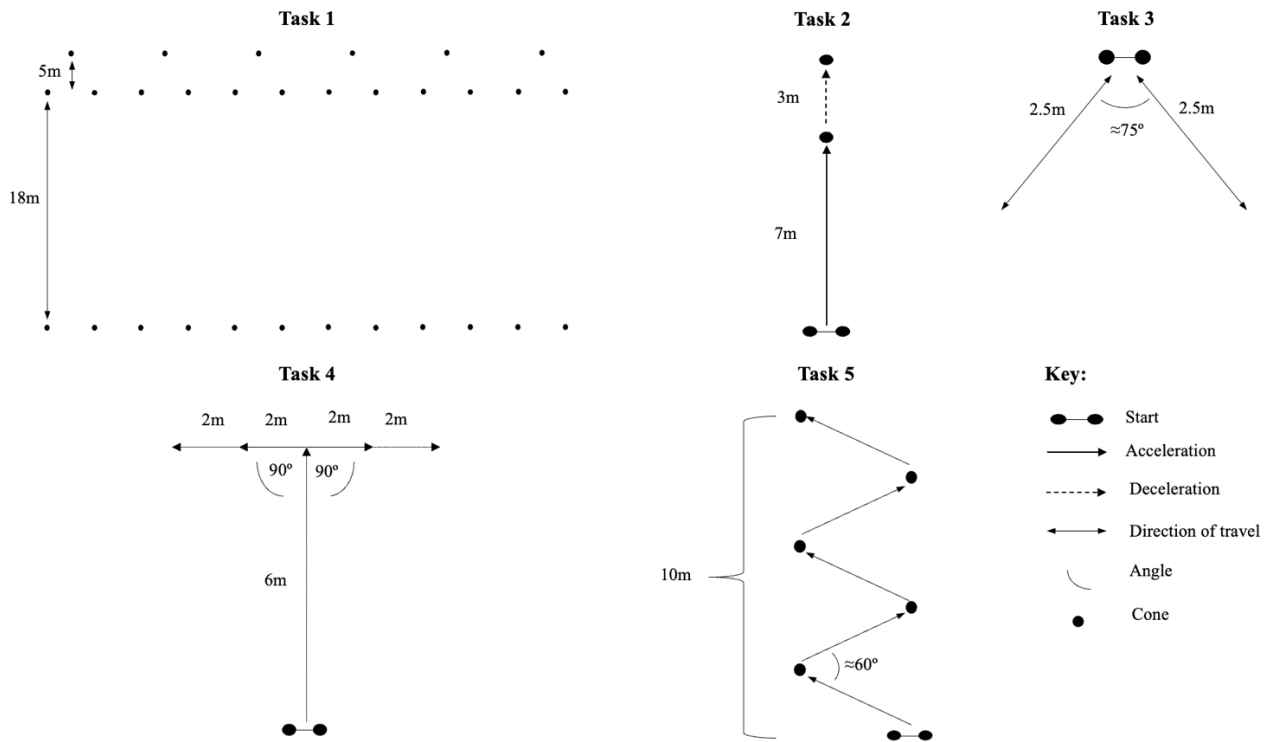
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542 *Figure 2 - diagram of the tasks*

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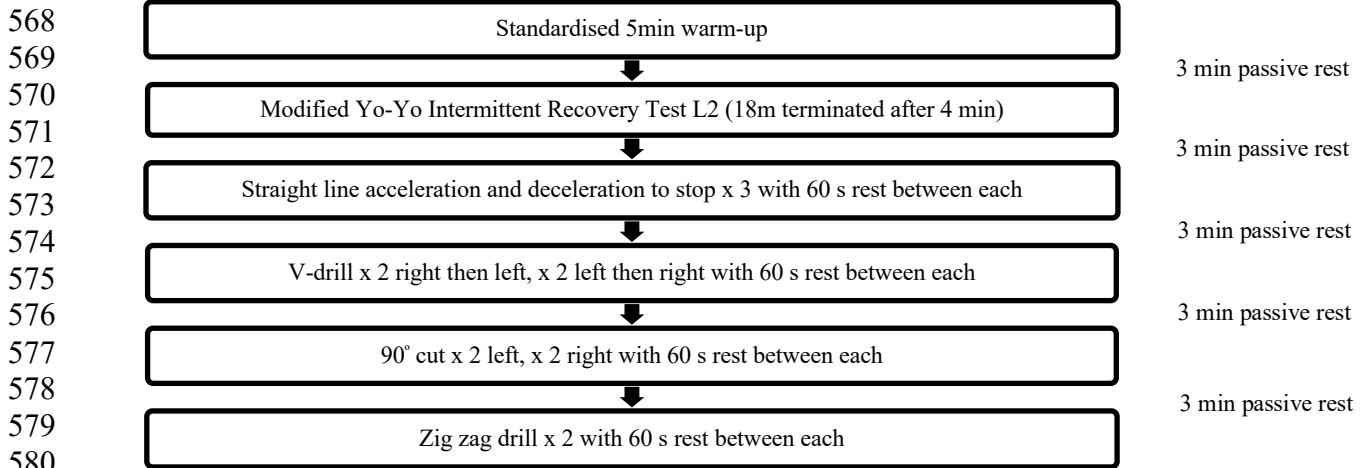
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581 *Figure 3 - details and order of tasks and trials*

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