

VALIDITY OF AN INERTIAL MEASUREMENT UNIT SYSTEM TO ASSESS LOWER-LIMB KINEMATICS DURING A MAXIMAL LINEAR DECELERATION

Alastair R. Jordan,^{1, A, B, C, D} Howie J. Carson,^{2, A, B, C, D} Brett Wilkie,^{1, C, D}
Damian J. Harper^{3, A, B, C, D}

¹ School of Science Technology and Health, York St John University, Haxby Road Sports Park, York, YO31 8TA, United Kingdom

² Institute for Sport, Physical Education and Health Sciences, Moray House School of Education and Sport, The University of Edinburgh, United Kingdom

³ Institute of Coaching and Performance, School of Sport and Health Sciences, University of Central Lancashire, United Kingdom

^A Study Design; ^B Data Collection; ^C Statistical Analysis; ^D Manuscript Preparation

Address for correspondence:

Alastair R. Jordan
School of Science Technology and Health, York St John University
Haxby Road Sports Park, YO31 8TA, United Kingdom
Email: a.jordan1@yorks.ac.uk

Abstract This study examined the validity of an inertial measurement unit system for measuring lower-limb joint kinematics during linear decelerations. A male team athlete (age 36 years, stature 1.75 m, mass 80.0 kg) performed multiple linear decelerations, following 20 m runs at 50%, 75% and 100% self-perceived effort. Inertial measurement unit sensors were strapped to lower-limb segments and retroreflective markers were adhered to the lower-limbs for 3D optical motion analysis. Ground contact time, foot to centre of mass displacement (foot-COM), peak and minimum angle, mean angular velocity and range of motion at the ankle, knee and hip during the contact phases of each deceleration were determined. Measures were valid if a very large correlation ($r \geq 0.7$) and small bias (effect size < 0.6) were evident. Following 50% effort, ground contact time, foot-COM and most hip and knee kinematics were valid. Ground contact time, foot-COM and knee flexion velocity and range of motion were valid following 75% efforts. Ground contact time and knee flexion velocity were valid following 100% effort. Therefore, the inertial measurement unit system tested can be used to assess temporal-spatial parameters during a deceleration regardless of the preceding effort, and hip and knee kinematics following low intensity running.

Key words biomechanics, braking, IMU, stopping, Xsens

Introduction

An ability to decelerate is emerging as a critical component of sport performance (Harper, Jordan, Kiely, 2021; Harper, Kiely, 2018; Hewit, Cronin, Button, Hume, 2011). Analyses of team-based sports, such as soccer, have indicated as many as 430 lower intensity ($\leq -2 \text{ m.s}^{-2}$) decelerations (Mara, Thompson, Pumpa, Morgan, 2017) and approximately 43–54 high intensity decelerations ($\leq -3 \text{ m.s}^{-2}$) during a match (Bloomfield, Poman, O'Donoghue, 2008; Dalen, Ingebrigtsen, Ettema, Hjelde, Wisloff, 2016; Russell et al., 2016). Deceleration underpins many of the

hundreds of changes in movement patterns observed in a match, including stopping to evade an opponent or collision (Hewit et al., 2011) and precedes a change of direction (Chaouachi et al., 2012; Dos'Santos, Thomas, Comfort, Jones, 2018; Green, Blake, Caulfield, 2011).

Faster deceleration requires the centre of mass to be positioned more posterior to the lead foot at ground contact, thereby maximising horizontal braking force application (Cesar, Sigward, 2015; Hewit et al., 2011). Upon contact with the ground, high eccentric loading of the lower-limbs results in rapid hip and knee flexion and dorsiflexion of the ankle to disperse the impact forces effectively (Nedergaard, Kersting, Lake, 2014; Spiteri et al., 2014). Furthermore, it has been suggested that a high proportion of non-contact lower-limb injuries, such as anterior cruciate ligament or posterior chain musculature, occur during the contact phase of deceleration when the knee is at or near full extension and then undergoes rapid eccentric knee flexion (Chaouachi et al., 2012; Cochrane, Lloyd, Butfield, Seward, McGivern, 2007; Kovacs, Roetert, Ellenbecker, 2008). Consequently, execution of appropriate deceleration kinematic strategies is essential to maximising deceleration performance and minimising injury risk.

Deceleration technique can be assessed by 3-dimensional optical motion analysis (3DOMA) as the gold standard for movement analysis, however these camera-based systems are expensive, athletes must perform within the confines of a calibrated capture volume that is typically small and reflective markers can be obscured at critical moments during a dynamic performance. Inertial measurement units (IMU) consist of gyroscopes, magnetometers and accelerometers contained within unobtrusive lightweight units and could provide valid information on deceleration kinematics, without the drawbacks of 3DOMA. IMU systems are easier to set up and can be used in field-based environments where athletes are not constrained to a calibrated capture volume. A commonly researched IMU system is the Xsens Technologies B.V (Adesida, Papi, McGregor, 2019; Camomilla, Bergamini, Fantozzi, Vannozzi, 2018) and has been used to assess movement in a variety of functional movement tasks (Fleron, Ubbesen, Battistella, Dejtiar, Oliveira, 2019; Laudanski, Brouwer, Li, 2013; Zhang, Novak, Brouwer, 2013) and sporting contexts (Blair, Duthie, Robertson, Hopkins, Ball, 2018; Carson, Collins, Richards, 2014; Krüger, Edelmann-Nusser, 2009; Reenalda, Maartens, Homan, Buurke, 2016; Wouda et al., 2018).

Despite extensive usage of the Xsens IMU system, there has been limited attention to the validity of measures, particularly those associated with tasks involving whole body deceleration. Valid measures of performance are essential to provide coaches and athletes with valuable information on sport performance from injury prevention and performance enhancement perspectives. Xsens has been validated against 3DOMA and demonstrated very good – excellent validity for sagittal plane flexion and extension angles during walking, stair ascent and descent (Seel, Raisch, Schauer, 2014; Zhang et al., 2013) and treadmill running at different speeds (Wouda et al., 2018). Lower validity has been shown in frontal and transverse plane kinematics (Wouda et al., 2018; Zhang et al., 2013), whilst transitioning between acceleration and deceleration during walking (Fleron et al., 2019) and with faster lower-limb segment velocities (Blair et al., 2018; Ferrari et al., 2010). Based on these findings, validity should be reported for speed and type of movement.

Currently, the validity of Xsens IMU systems for measuring lower-limb kinematics during deceleration from various running speeds is unknown. Therefore, the aim of this study was to assess the concurrent validity of lower-limb joint kinematic measures from the Xsens IMU system compared with 3DOMA during linear decelerations from various running speeds.

Methods

Participant

Following institutional ethical approval, a male competitive soccer player (age 36 years, stature 1.72 m, mass 80.0 kg) with 15 years previous playing experience provided written consent to participate in this study. The participant regularly took part in soccer training and moderate-to-vigorous intensity physical activity (3–5 times per week) lasting between 60–90 minutes per session and was, therefore, accustomed to acceleration and deceleration type activities. This study adopted a single-participant approach, which has been used in previous research by Buchheit, Gray, Morin (2015).

Deceleration Task

The participant performed a series of acceleration-deceleration ability tests (ADA) on one occasion. As described by Harper et al. (2021), the ADA consists of a 20 m run, a maximal linear deceleration after crossing the 20 m line and backpedal to the 20 m line (Figure 1). The backpedal created a clear ‘stop’ event and indicated the end of the deceleration phase (Harper et al., 2021).

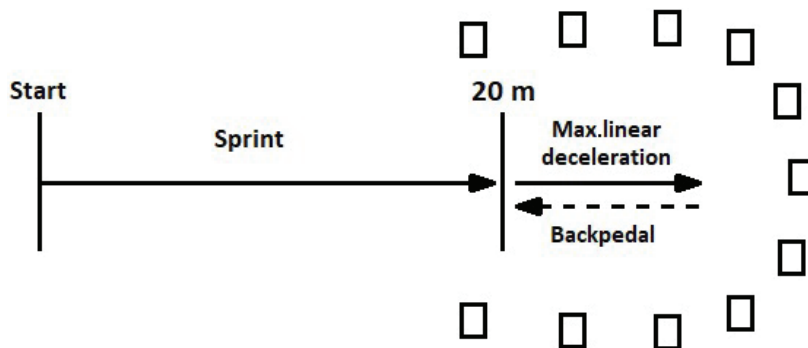


Figure 1. Acceleration-deceleration ability (ADA) test used to assess maximal linear deceleration. Symbol □ denotes position of 3D optical motion analysis cameras

To assess the validity of the Xsens IMU system when decelerating from various speeds, the participant performed 10 × 20 m runs at 50%, 75% and 100% self-perceived effort (30 trials in total) separated by 3–5 minutes of rest. A minimum 3 min rest between each ADA trial was considered sufficient recovery for the participant and exceeded the durations and work:rest ratios suggested in previous research to achieve a rested state following similar short bouts of sprint activity (Abt, Siegler, Akubat, Castagna, 2011; Balsom, Seger, Sjödin, Ekblom, 1992; Coleman, 2001; Spencer, Bishop, Dawson, Goodman, 2005). A maximum 5 min recovery was permitted to check and address the equipment calibration. Xsens IMU system captured kinematics in the entire ADA whereas 3DOMA captured the deceleration phase only.

Inertial Measurement Unit System

In accordance with manufacturer instructions, Xsens IMU sensors (MTx2, Xsens MVN Biomech, Xsens Technologies, The Netherlands) were strapped firmly to segments of the participant's lower-limbs, specifically at the feet (midpoint of the bridge of the foot), shanks (medial surface of the tibia), thighs (lateral aspect above the knee) and pelvis (midpoint of the sacrum). MVN Studio Pro software (Xsens Technologies, The Netherlands) was used to calibrate and track the IMUs (240 Hz) during the ADA. The calibration protocol began with the participant standing in the N-pose (arms neutral besides body) and a series of movements to orientate IMU sensors and functional axes of body segments. The participant's body height, arm span, foot size and anatomical landmarks of the greater trochanter (hip height from the ground), lateral femoral epicondyle (knee height from the ground), lateral malleolus (ankle height from the ground), left and right anterior superior iliac spine (hip width) were measured to estimate joint centres and segment dimensions of the model in MVN Studio Pro software.

3D Optical Motion Analysis (3DOMA)

Eleven infrared 3DOMA cameras (Oqus 300, Qualisys, Sweden) were positioned around the deceleration area (Figure 1). Qualisys Track Manager™ software (Qualisys, Sweden) was used to calibrate (average residuals of <1mm) and track (240 Hz) spherical retroreflective markers (Qualisys, Sweden) adhered to the participant's skin or the Xsens elasticated suit (Figure 2).

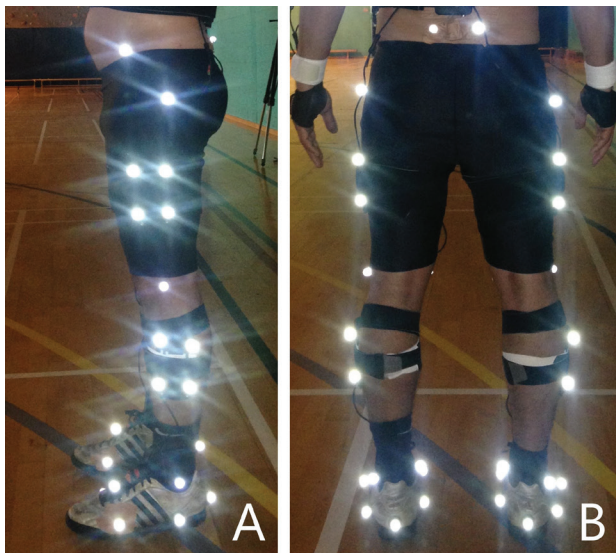


Figure 2. Sagittal (A) and posterior view (B) of the participant with Xsens IMU sensors strapped to lower-limb segments with retroreflective markers overlying anatomical landmarks and cluster markers strapped to lower-limb segments

Retroreflective markers were positioned bilaterally on the anterior superior iliac spine, posterior superior iliac spine, greater trochanter, medial and lateral femoral epicondyle, medial and lateral malleoli, calcaneus and the superior aspect of the foot, plus the 1st and 5th metatarsal heads. Cluster markers (four markers on a rigid baseplate) were positioned on the lateral aspect of the thigh and shank and affixed firmly with compression wraps (Fabrifoam, Applied Technology International Ltd., Pennsylvania, USA). Following a static capture trial (from both the 3DOMA and Xsens IMU), the medial and lateral femoral epicondyles, medial and lateral malleoli and greater trochanter markers were removed prior to performing the ADA. A single reflective marker was placed on the 20 m line to signify the beginning of the deceleration phase of the ADA.

Data Analysis

3DOMA marker trajectories during deceleration phase were labelled in Qualisys Track Manager™ software and exported to Visual 3D motion analysis software in c3d file format (C-Motion, Rockville, MD, USA) for further processing and analysis. Raw 3DOMA marker coordinate data were interpolated and filtered using a zero-lag fourth order low-pass Butterworth filter with a cut-off frequency of 30 Hz to remove clear high frequency noise in the signal (Nedergaard et al., 2014). The segment information (axes of rotation, segment dimensions and orientation) from the Xsens IMU data were also exported to c3d file format into Visual 3D software for analysis. The Xsens IMU data were filtered and processed by manufacturer software (MVN Studio Pro, Xsens Technologies, The Netherlands), therefore further filtering was not required in Visual 3D. Visual 3D created six-degrees of freedom multi-segmental models from the 3DOMA marker data and Xsens IMU data. Both systems were assigned joint centres defined by the medial and lateral markers on the proximal and distal aspects for each segment using the single frame of a static calibration trial (y-axis = anterior-posterior, x-axis = medial-lateral and z-axis = proximal-distal). Joint kinematics were calculated in flexion/extension using the distal segment relative to the local coordinate system of the proximal segment, using an X (flexion/extension), Y (medial/lateral), Z (axial) Cardan sequence.

Temporal-spatial and kinematic data were analysed for the deceleration phase only, defined as the first foot contact after the model COM passed the deceleration marker (20 m line) to the last ground contact prior to posterior movement of the model in the backpedal. Initial contacts were identified as the minimum vertical position of the calcaneus marker (heel strike) or the 5th metatarsal marker (forefoot strike) (Cesar, Sigward, 2016). Toe off was identified at the onset of vertical displacement of the 5th metatarsal (Cesar, Sigward, 2015). All initial contact and toe off events, for both 3DOMA and Xsens IMU, were verified by visual inspection. Temporal-spatial parameters of interest were ground contact time (GCT) and anterior/posterior foot to COM displacement. Sagittal plane kinematic variables of interest during trials at 50%, 75% and 100% effort included peak and minimum joint angles, average angular velocity (flexion MAV and extension MAV) and range of motion (ROM) at the hip, knee and ankle during contact phase. Approach velocity into the deceleration phase was determined in 50%, 75% and 100% efforts using the velocity of the COM in the 3DOMA.

Statistical Analysis

Mean and standard deviation (SD) of all variables during trials at 50%, 75% and 100% effort were calculated from 3DOMA and Xsens IMU system. The agreement between Xsens and 3DOMA (criterion measure) measures was assessed using a spreadsheet by Hopkins (2017). The spreadsheet calculated Pearson's correlation coefficient (r), mean difference ($\pm 90\%$ confidence limits (CL)) and effect size (ES, $\pm 90\%$ CL) and raw typical error of estimate

(TEE, $\pm 90\%$ CL) to assess strength of relationships, systematic bias and typical error between measurements, respectively. The magnitude of the Pearson's r was interpreted as ≤ 0.1 , trivial; $>0.1-0.3$, small; $>0.3-0.5$, moderate; $>0.5-0.7$, large; $>0.7-0.9$, very large; and $>0.9-1.0$, almost perfect (Hopkins, 2002). Thresholds for ES were <0.2 , trivial; $0.2-0.6$, small; $0.6-1.2$, moderate; $1.2-2.0$, large; $2-4$, very large and >4 extremely large (Hopkins, 2002). Temporal-spatial and kinematic measures were considered valid if a very large correlation ($r \geq 0.7$) and small bias (ES < 0.6) were evident. Differences in approach velocity between 50%, 75% and 100% efforts were determined by within-subjects repeated measures ANOVA with Bonferroni pairwise comparisons (Jamovi version 0.9, Jamovi Project, Amsterdam, The Netherlands).

Results

The participant's perceptions of effort on the approach to the deceleration resulted in significant differences in approach velocities ($p < 0.05$). As perceived effort increased from 50%, 75% and 100%, approach velocity increased (3.61 ± 0.33 , 5.81 ± 0.14 and 6.45 ± 0.24 m.s⁻¹, respectively).

Table 1. Mean (standard deviation) of temporal-spatial parameters (Ground Contact Time (GCT) and anterior foot to centre of mass displacement (Foot-COM) and sagittal plane kinematics (peak and minimum joint angles, mean angular velocity (MAV) and range of motion (ROM)) during 10 deceleration trials preceded by 20 m runs at 50% effort (3.61 m.s⁻¹), measured by 3D optical motion analysis (3DOMA) and IMU system. Validity between systems assessed using Pearson correlation coefficients (r) and mean difference ($\pm 90\%$ confidence limits (CL)) with effect size (ES, $\pm 90\%$ CL). Magnitudes are presented for r and ES (m)

Variable	n	3DOMA		IMU	r	m	Mean Difference		ES	m	Raw TEE	
		mean (SD)					($\pm 90\%$ CL)				($\pm 90\%$ CL)	
Temporal-spatial												
GCT (s)	33	0.24 (0.04)	0.25 (0.04)	0.87	VL	0.01 (0.00 to 0.01)	0.13 (-0.02 to 0.27)	T	0.02 (0.02 to 0.02)			
Foot-COM (m)	28	0.39 (0.06)	0.40 (0.05)	0.80	VL	-0.02 (-0.03 to 0.01)	-0.33 (-0.52 to -0.14)	S	0.03 (0.03 to 0.04)			
Ankle												
Peak dorsiflexion (°)	33	13.9 (5.4)	15.6 (4.7)	0.06	S	1.7 (-0.4 to 3.75)	-0.37 (0.00 to 0.74)	S	5.5 (4.5 to 7.0)			
Peak plantarflexion (°)	33	15.1 (3.6)	4.2 (5.4)	0.45	M	10.9 (9.4 to 12.4)	3.00 (2.60 to 3.41)	VL	3.2 (2.7 to 4.1)			
ROM (°)	33	29.0 (4.7)	19.7 (6.7)	0.14	S	-9.3 (-11.5 to -7.0)	-1.61 (-2.07 to -1.15)	L	5.4 (4.5 to 6.9)			
MAV dorsiflexion (°·s ⁻¹)	33	229.3 (71)	146.3 (84.2)	0.39	M	-83.0 (-108.5 to -57.6)	-1.17 (-1.53 to -0.81)	M	66.4 (55.1 to 84.3)			
MAV plantarflexion (°·s ⁻¹)	33	307.4 (113.5)	218.3 (104.8)	0.45	M	-89.1 (-123.0 to -55.2)	-0.79 (-1.08 to -0.49)	M	103.1 (85.6 to 130.7)			
Knee												
Minimum flexion (°)	33	20.0 (7.0)	23.9 (5.5)	0.80	VL	-3.9 (-5.2 to -2.8)	-0.57 (-0.75 to -0.40)	S	4.3 (3.5 to 5.4)			
Peak flexion (°)	33	93.1 (5.4)	93.6 (7.4)	0.69	L	-0.5 (-2.1 to 1.1)	-0.09 (-0.39 to 0.20)	T	4.0 (3.3 to 5.0)			
ROM (°)	33	73.1 (9.4)	69.6 (10.7)	0.93	AP	-3.5 (-4.7 to -2.3)	-0.37 (-0.50 to -0.24)	S	3.6 (3.0 to 4.6)			
MAV flexion (°·s ⁻¹)	33	325.0 (76.3)	303.2 (73.0)	0.98	AP	-21.8 (-25.9 to -17.8)	-0.29 (-0.34 to -0.23)	S	13.8 (11.4 to 17.4)			
Hip												
Peak flexion (°)	32	48.5 (6.2)	47.2 (6.7)	0.95	AP	-1.3 (-1.9 to -0.7)	-0.21 (-0.31 to -0.11)	S	1.9 (1.6 to 2.4)			
Peak extension (°)	32	37.6 (5.7)	35.7 (6.1)	0.95	AP	-1.8 (-2.4 to -1.3)	-0.32 (-0.42 to -0.22)	S	1.8 (1.5 to 2.3)			
ROM (°)	32	10.9 (3.2)	11.5 (3.8)	0.83	VL	0.5 (-0.1 to 1.2)	0.17 (-0.03 to 0.36)	T	1.8 (1.5 to 2.3)			
MAV flexion (°·s ⁻¹)	32	90.2 (29.1)	102.6 (32.2)	0.78	VL	12.4 (6.3 to 18.5)	0.43 (0.22 to 0.64)	S	18.4 (15.3 to 23.5)			
MAV extension (°·s ⁻¹)	32	74.1 (42.0)	85.1 (43.4)	0.65	L	10.9 (0.1 to 21.7)	0.26 (0.00 to 0.52)	S	32.6 (27.0 to 41.5)			

At 50% effort on the approach (3.61 m.s⁻¹, see Table 1), measures of temporal-spatial parameters and most kinematics at the knee and hip obtained by Xsens IMU were valid as per criteria ($r \geq 0.7$ and $ES < 0.6$). Large-almost perfect correlations and trivial-small ES were found in temporal-spatial parameters and kinematics at the knee and hip. Peak knee flexion and hip extension MAV were very close to meeting the criteria with large correlation and trivial-small ES ($r = 0.69$ and -0.09 ES, $r = 0.65$ and 0.26 ES, respectively). The ankle kinematics did not meet the criteria of validity due to small-moderate correlation coefficients and small-very large ES.

Table 2. Mean (standard deviation) of temporal-spatial parameters (Ground Contact Time (GCT) and anterior foot to centre of mass displacement (Foot-COM) and sagittal plane kinematics (peak and minimum joint angles, mean angular velocity (MAV) and range of motion (ROM)) during 10 deceleration trials preceded by 20 m runs at 75% effort (5.81 m.s⁻¹), measured by 3D optical motion analysis (3DOMA) and IMU system. Validity between systems assessed using Pearson correlation coefficients (r) and mean difference ($\pm 90\%$ confidence limits (CL)) with effect size (ES, $\pm 90\%$ CL). Magnitudes are presented for r and ES (m)

Variable	n	3DOMA	IMU	r	m	Mean Difference	ES	m	Raw TEE
		mean (SD)				($\pm 90\%$ CL)			($\pm 90\%$ CL)
Temporal-spatial									
GCT (s)	31	0.18 (0.04)	0.20 (0.04)	0.92	AP	0.02 (0.02 to 0.03)	0.48 (0.36 to 0.61)	S	0.02 (0.01 to 0.02)
Foot-COM (m)	26	0.40 (0.13)	0.42 (0.05)	0.84	VL	-0.02 (-0.06 to 0.01)	-0.18 (-0.46 to 0.11)	T	0.03 (0.02 to 0.03)
Ankle									
Peak Dorsiflexion (°)	29	7.7 (4.5)	7.7 (4.9)	0.35	M	0.0 (-1.7 to 1.7)	0.00 (-0.38 to 0.38)	T	4.3 (3.49 to 5.50)
Peak Plantarflexion (°)	29	22.8 (6.5)	11.5 (6.8)	0.66	L	11.3 (9.5 to 13.1)	1.73 (1.46 to 2.00)	L	5.0 (4.10 to 6.45)
ROM (°)	29	30.6 (4.7)	19.2 (7.3)	0.60	L	-10.9 (-12.7 to -9.0)	-2.33 (-2.73 to -1.93)	VL	3.8 (3.13 to 4.93)
MAV Dorsiflexion (°·s ⁻¹)	29	364.3 (78.7)	194.5 (99.8)	0.22	T	-169.8 (-205.3 to 134.2)	-2.16 (-2.61 to -1.71)	VL	77.0 (62.8 to 100.8)
MAV Plantarflexion (°·s ⁻¹)	29	428.2 (259.6)	247.5 (184.9)	0.28	S	-180.7 (-271.6 to -89.8)	-0.70 (-1.05 to -0.35)	M	161.6 (130.6 to 214.1)
Knee									
Minimum Flexion (°)	30	17.0 (4.7)	19.8 (5.1)	0.28	S	-2.8 (-4.6 to -1.0)	-0.60 (-0.99 to -0.22)	M	4.6 (3.8 to 5.9)
Peak Flexion (°)	30	95.5 (5.3)	97.1 (8.7)	0.53	L	-1.6 (-3.9 to 0.7)	-0.31 (-0.74 to 0.13)	S	4.6 (3.7 to 5.9)
ROM (°)	30	78.5 (5.2)	77.3 (6.9)	0.90	VL	-1.2 (-2.8 to -0.4)	-0.22 (-0.41 to -0.04)	S	2.3 (1.9 to 3.0)
MAV Flexion (°·s ⁻¹)	30	461.6 (105.1)	417.6 (88.7)	0.93	AP	-44.1 (-56.3 to -31.8)	-0.42 (-0.54 to -0.30)	S	38.3 (31.4 to 49.5)
Hip									
Flexion (°)	28	42.5 (4.3)	44.8 (9.5)	0.61	L	2.3 (-0.2 to 4.8)	0.54 (-0.04 to 1.1)	S	3.4 (2.8 to 4.5)
Extension (°)	28	34.0 (5.4)	31.4 (7.5)	0.61	L	-2.6 (-4.5 to -0.6)	-0.47 (-0.83 to -0.12)	S	4.3 (3.6 to 5.6)
ROM (°)	28	8.5 (2.9)	13.3 (5.2)	0.43	M	4.8 (3.3 to 6.4)	1.68 (1.15 to 2.21)	L	2.7 (2.2 to 3.5)
MAV Flexion (°·s ⁻¹)	28	128.7 (114.0)	151.0 (63.8)	-0.05	T	22.3 (-20.69 to 65.36)	0.20 (-0.18 to 0.57)	S	116.0 (94.9 to 150.8)
MAV Extension (°·s ⁻¹)	25	137.4 (95.6)	151.0 (81.3)	0.01	T	13.6 (-29.11 to 56.30)	0.14 (-0.30 to 0.59)	T	97.65 (79.0 to 129.4)

Following an approach at 75% effort (5.81 m.s⁻¹, see Table 2), the temporal-spatial parameters, knee ROM and knee flexion MAV obtained by Xsens IMU met the criteria for validity with very large-almost perfect correlation coefficients and trivial-small ES. Other measures of knee kinematics demonstrated small-moderate ES but were not were valid due to small-large correlations. Likewise, only trivial-large correlations were found in other measures at the hip with trivial-small ES. Hip flexion and extension were close to meeting the validity criteria with large correlation ($r = 0.61$) and small ES (0.54 and -0.47, respectively). None of the ankle kinematics met the criteria for validity and were attributed to trivial-large correlations and trivial-very large ES.

Table 3. Mean (standard deviation) of temporal-spatial parameters (Ground Contact Time (GCT) and posterior foot to centre of mass displacement (Foot-COM) and sagittal plane kinematics (peak and minimum joint angles, mean angular velocity (MAV) and range of motion (ROM)) during 10 deceleration trials preceded by 20 m runs at 100% effort (6.45 m.s⁻¹), measured by 3D optical motion analysis (3DOMA) and IMU system. Validity between systems assessed using Pearson correlation coefficients (*r*) and mean difference ($\pm 90\%$ confidence limits (CL)) with effect size (ES, $\pm 90\%$ CL). Magnitudes are presented for *r* and ES (*m*)

Variable	n	3DOMA	IMU	<i>r</i>	<i>m</i>	Mean Difference	ES	<i>m</i>	Raw TEE
		mean (SD)	mean (SD)			($\pm 90\%$ CL)			($\pm 90\%$ CL)
Temporal-spatial									
GCT (s)	68	0.19 (0.04)	0.19 (0.04)	0.86	VL	0.00 (0.00 to 0.01)	0.07 (-0.03 to 0.18)	T	0.02 (0.02 to 0.03)
Foot-COM (m)	52	0.44 (0.06)	0.45 (0.06)	0.39	S	0.01 (-0.04 to -0.05)	0.21 (-0.06 to 0.48)	S	0.18 (0.16 to 0.22)
Ankle									
Peak Dorsiflexion (°)	68	5.7 (4.8)	2.1 (5.7)	0.41	M	-3.6 (-4.7 to -2.4)	-0.74 (-0.98 to -0.49)	M	4.5 (3.9 to 5.2)
Peak Plantarflexion (°)	68	25.3 (3.5)	20.6 (5.3)	0.48	M	4.7 (3.7 to 5.6)	1.35 (1.07 to 1.63)	L	3.1 (2.7 to 3.6)
ROM (°)	68	31.0 (4.5)	22.7 (7.4)	0.53	L	-8.3 (-9.8 to -7.2)	-1.91 (2.20 to -1.62)	L	3.8 (3.3 to 4.4)
MAV Dorsiflexion (°·s ⁻¹)	68	376.5 (99.9)	225.7 (114.3)	0.27	S	-150.8 (-177.0 to -124.6)	-1.51 (-1.77 to -1.25)	L	96.8 (84.8 to 113.2)
MAV Plantarflexion (°·s ⁻¹)	68	483.7 (130.1)	275.8 (188.4)	0.44	M	-207.9 (-224.3 to -171.6)	-1.60 (-1.88 to -1.32)	L	117.8 (102.9 to 138.2)
Knee									
Minimum Flexion (°)	69	19.0 (8.7)	15.2 (4.3)	0.45	M	3.8 (2.2 to 5.3)	0.44 (0.26 to 0.62)	S	7.8 (6.8 to 9.1)
Peak Flexion (°)	69	95.5 (9.4)	88.7 (10.6)	0.45	M	6.8 (-8.9 to -4.7)	0.72 (0.50 to 0.95)	M	8.5 (7.4 to 9.9)
ROM (°)	69	76.5 (9.0)	73.5 (10.4)	0.29	S	-3.0 (-5.7 to -0.3)	-0.46 (-0.72 to -0.20)	S	8.7 (7.6 to 10.1)
MAV Flexion (°·s ⁻¹)	69	469.4 (104.7)	441.2 (97.2)	0.84	VL	-28.2 (-39.7 to -16.8)	-0.27 (-0.38 to -0.16)	S	56.9 (49.9 to 66.4)
Hip									
Peak flexion (°)	69	42.8 (4.8)	37.9 (5.7)	0.74	VL	-4.9 (-5.7 to -4.2)	-1.03 (-1.19 to -0.87)	M	3.2 (2.8 to 3.8)
Peak extension (°)	69	32.3 (4.7)	23.1 (6.6)	0.65	L	-8.8 (-9.86 to -7.81)	-1.94 (-2.18 to -1.69)	L	3.7 (3.2 to 4.3)
ROM (°)	69	10.5 (3.4)	14.8 (5.8)	0.35	M	4.3 (3.1 to 5.4)	1.37 (0.97 to 1.78)	L	3.2 (2.8 to 3.8)
MAV Flexion (°·s ⁻¹)	68	168.0 (126.5)	174.5 (62.0)	0.09	T	6.5 (-21.1 to 34.0)	0.05 (-0.17 to 0.27)	T	127.0 (11.2 to 148.4)
MAV Extension (°·s ⁻¹)	69	121.2 (77.5)	159.7 (84.9)	0.37	M	40.6 (21.9 to 59.3)	0.50 (0.27 to 0.73)	S	75.6 (66.3 to 88.3)

At 100% effort on the approach (6.45 m.s⁻¹, see Table 3), only GCT and knee flexion MAV obtained by the Xsens IMU system met the criteria for validity with very large correlations and trivial–small ES. Other kinematics at the knee and hip demonstrated small–moderate correlations with small–moderate ES and trivial–very large with trivial–large ES, respectively. Ankle kinematics did not meet the criteria for validity due to small–large correlations and moderate–large ES.

Discussion

This study sought to assess the validity of Xsens IMU system to measure temporal-spatial and lower-limb joint kinematic measures captured during a maximal linear deceleration, preceded by 20 m runs at 50%, 75% and 100% effort, when compared with 3DOMA. The key findings from this study were that during deceleration phase, Xsens IMU system had valid measures of: (1) knee and hip sagittal plane kinematics and temporal-spatial parameters from low approach velocities (3.61 m.s⁻¹, 50% effort), (2) knee flexion MAV, knee ROM and temporal spatial parameters from moderate approach velocity (5.81 m.s⁻¹, 75% effort), and (3) only GCT, knee flexion MAV from higher approach velocity (6.45 m.s⁻¹, 100% effort). None of the ankle kinematics derived from Xsens IMU met the criteria of validity.

The results of this study are comparable to other studies on the validity of Xsens IMU to measure temporal-spatial parameters and joint kinematics during sport and physical activities. In this study, the hip and knee kinematics demonstrated large to almost perfect agreement ($r = 0.69$ – 0.98 and 0.5 – 0.95), trivial to small ES (-0.09 to -0.57 and -0.32 – 0.43) and comparably low typical error (TEE = 1.8 – 1.9° and 3.6 – 4.3°) when decelerating from low intensity running (50% efforts). Similarly, strong agreement between Xsens and 3DOMA ($r > 0.96$) and similar estimates of the error associated with Xsens measurements of the hip (1.8 – 5.2°) and knee (1.5 – 5.1°) kinematics were found during walking (Ferrari et al., 2010; Seel et al., 2014; Zhang et al., 2013). Wouda et al. (2018) also reported strong agreement ($r > 0.98$) between Xsens and 3DOMA at the hip and knee during treadmill running at different speeds, however when compared with our study, larger errors were observed (mean difference $<18.1^\circ$ at the hip and $<10.2^\circ$ at knee). Krüger and Edelman-Nusser (2009) also reported strong agreement ($r = 0.77$ – 0.96) and errors of less than 5° for knee angles during a snowboarding turn, when compared with video analysis. When compared with the present study, smaller measurement error has been shown at the knee (peak flexion: 0.8° , peak extension: 1.4° and mean angular velocity: $14^\circ \cdot s^{-1}$) and hip (hip extension: 0.5°) during a kicking action (Blair et al., 2018). Such high validity might be attributable to a simpler task of kicking, relative to deceleration, which involves many co-ordinated steps in quick succession.

As approach velocity increased (75%–100%), the agreement between kinematic measures were weak at the hip ($r = 0.43$ – 0.61 and 0.35 – 0.74 , respectively) and reduced at the knee ($r = 0.28$ – 0.93 and 0.29 – 0.45 , respectively) and typical error increased at the hip (2.7 – 4.3° and 3.2 – 3.7° respectively) and knee (2.3 – 4.6° and 7.8 – 8.7° , respectively) when compared with 50% effort. Also, the mean difference and ES increased, which suggests an increased systematic bias as intensity increased, hence most Xsens IMU measurements were not valid at higher intensities. Interestingly, knee flexion MAV was valid following 75% and 100% efforts. Rapid knee flexion during deceleration is a key indicator of injury during deceleration (Cochrane et al., 2007) and therefore this measure could be useful for practitioners, however with greater approach velocity typical error increased from 38.3 to $56.9^\circ \cdot s^{-1}$. Similarly, an increase in joint kinematic error was reported as gait speed increased (0.6 – 5.0° ; Ferrari et al., 2010) and as segment velocity increased during a ball kicking action (Blair et al., 2018). The increased error with speed of movement has been attributed to the inertial sensor data gleaned from IMU, which can be compromised when sudden changes in acceleration are experienced (Fleron et al., 2019). Erroneous accelerations in IMU data might be exacerbated by greater skin and muscle movement underlying the IMUs during deceleration from faster approach velocities due to greater impact forces applied to the lower limb when compared with deceleration from slower approach velocities. Also, Xsens uses Kalman filters to fuse the IMU data, however Kalman filtering is limited during faster movements, especially from high to low segment acceleration (Adesida et al., 2019; Blair et al., 2018; Ferrari et al., 2010). Sudden changes in segmental acceleration are characteristic of deceleration and are greater in more intense decelerations, thus potentially compromising the measurement of most kinematic measures during deceleration from higher intensity running (5.81 m.s $^{-1}$ – 6.45 m.s $^{-1}$, 75%–100% effort).

Regardless of effort on the approach, ankle kinematics during linear deceleration did not meet the criteria for validity. Mixed reports of the validity of ankle measurement by IMU has been reported previously (Ferrari et al., 2010; Robert-Lachaine, Mecheri, Larue, Plamondon, 2017; Seel et al., 2014). The error of Xsens at the ankle has been reported to be low in the sagittal plane during walking (Ferrari et al.: $r > 0.99$ and 1.1 – 1.4° ; Seel et al.: 1.6°) which surpasses the validity of sagittal plane ankle measures found in this study of 3.1 – 5.5° , however others have reported weaker validity at the ankle which are somewhat comparable with this study. During treadmill running,

Wouda et al. (2018) observed strong agreement in dorsi and plantarflexion ($r > 0.97$), however mean difference and error was larger ($>7.58^\circ$ and $>8.1^\circ$, respectively) than in this study. There are several reasons for poorer validity at the ankle. The highest segment velocities are observed at the distal end of limbs and therefore the foot might be affected by the aforementioned Kalman filter, thus introducing error to the ankle, even during decelerations from low intensity running (50% efforts). The Kalman filter was purported to be responsible for sudden changes in orientation of body segments in the Xsens system during walking, most of which occurred at the ankle (Ferrari et al., 2010). This might account for the lack of valid measures at the ankle; however, the authors do not have definitive evidence of whether this was the case in this study. Another source of error could be attributed to the gyroscopes in the IMUs which are sensitive to vibrations when the foot contacts the ground. During deceleration, large impact and eccentric braking forces are observed upon contact with the ground (Hewit et al., 2011) and might introduce vibration noise to the IMU signal which was likely amplified as the intensity of deceleration increased.

The point of application of force relative to the COM is also important for deceleration performance and this study suggests that foot-COM measures lack validity during deceleration from high intensity running ($6.45 \text{ m}\cdot\text{s}^{-1}$, 100% effort) with large error observed (TEE 0.18 m) but is valid during deceleration preceded by low and moderate running ($3.61\text{--}5.81 \text{ m}\cdot\text{s}^{-1}$, 50–75% effort). Despite this, Xsens IMU system can be used to determine initial contact and toe-off and subsequently provide valid measures of GCT during linear decelerations. Ground contact time is an important determinant of deceleration as braking forces can only be applied during contact (Hewit et al., 2011). Using the methods detailed in this study, practitioners could use Xsens IMU to assess GCT during submaximal and maximal linear decelerations.

There are some limitations to acknowledge for this study. Movement artefact from underlying muscle and skin could result in displacements or translation of the IMU along the segment longitudinal axis which could affect segment orientation and subsequent calculation of joint angles. The Xsens IMU units were strapped firmly to the participant and the filtering process by Xsens might remove such movement artefact. Likewise, the 3DOMA might also be subject to movement artefact on the reflective markers, however such movements are reduced by appropriate filtering. The duration of between task and calibration of IMU system has been reported to introduce drift and error into the IMU data (Robert-Lachaine et al., 2017; Roetenberg, Luinge, Slycke, 2009). The participant undertook the calibration for both systems regularly to reduce the likelihood of drift. Fatigue of the participant from repeated ADA trials might have affected their ability to maintain consistent approach velocities for each perceived effort, especially in the repeated maximal ADA trials. The duration of recovery between the ADA trials ranged from 3–5 min, which was considered sufficient for the participant, a trained and competitive soccer player, to be rested and relatively small standard deviations were found for each approach velocity (0.33 , 0.14 and $0.24 \text{ m}\cdot\text{s}^{-1}$ at 50, 75 and 100% efforts, respectively). However, an objective physiological measure, such as heart rate monitoring, could have been used to confirm if the participant was indeed rested prior to each ADA trial. It has been noted that biomechanical model definitions might be responsible for differences and therefore caution must be taken when directly comparing joint angles from IMU and 3DOMA (Robert-Lachaine et al., 2017). The differences in the model were limited since both models were multi-segmental and the IMU model was closely aligned with anatomical landmarks used in 3DOMA.

In conclusion, Xsens IMU offers valid measures of joint kinematics of the hip and knee during linear decelerations when the approach velocity is low ($3.61 \text{ m}\cdot\text{s}^{-1}$, 50% effort) but limited to valid measures of knee flexion MAV when decelerating from higher approach velocities ($5.81\text{--}6.45 \text{ m}\cdot\text{s}^{-1}$, 75–100% efforts). Regardless

of approach velocity, Xsens IMU does not provide valid measurement of ankle kinematics during deceleration. Basic temporal-spatial parameters can be measured using Xsens IMU during deceleration following all approach velocities, except for foot-COM following 100% effort. Therefore, coaches and practitioners could use Xsens IMU to assess temporal-spatial parameters and kinematics of the hip and knee from low approach velocities ($>3.61 \text{ m}\cdot\text{s}^{-1}$) and limited knee kinematics at higher approach velocities. Despite the drawbacks of 3DOMA, it is recommended that 3DOMA should be considered for the assessment of decelerations from higher approach velocities.

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