



Systematic Review

The Use of Wearable Sensors for Preventing, Assessing, and Informing Recovery from Sport-Related Musculoskeletal Injuries: A Systematic Scoping Review

Ezio Preatoni ^{1,2}, Elena Bergamini ^{3,4}, Silvia Fantozzi ^{5,6}, Lucie I. Giraud ¹, Amaranta S. Orejel Bustos ^{3,4}, Giuseppe Vannozzi ^{3,4,*} and Valentina Camomilla ^{3,4}

- Department for Health, University of Bath, Bath BA2 7AY, UK; e.preatoni@bath.ac.uk (E.P.); lucie@teganet.eu (L.I.G.)
- ² Centre for Health and Injury and Illness Prevention in Sport, University of Bath, Bath BA2 7AY, UK
- Department of Movement, Human and Health Sciences, University of Rome "Foro Italico", Piazza L. de Bosis 6, 00135 Rome, Italy; elena.bergamini@uniroma4.it (E.B.); a.orejelbustos@studenti.uniroma4.it (A.S.O.B.); valentina.camomilla@uniroma4.it (V.C.)
- Interuniversity Centre of Bioengineering of the Human Neuromusculoskeletal System (BOHNES), University of Rome "Foro Italico", Piazza L. de Bosis 6, 00135 Rome, Italy
- Department of Electrical, Electronic, and Information Engineering "Guglielmo Marconi", University of Bologna, Viale Risorgimento 2, 40136 Bologna, Italy; silvia.fantozzi@unibo.it
- ⁶ Health Sciences and Technologies—Interdepartmental Centre for Industrial Research, University of Bologna, Viale Risorgimento 2, 40136 Bologna, Italy
- Correspondence: giuseppe.vannozzi@uniroma4.it; Tel.: +39-06-36733-522

Abstract: Wearable technologies are often indicated as tools that can enable the in-field collection of quantitative biomechanical data, unobtrusively, for extended periods of time, and with few spatial limitations. Despite many claims about their potential for impact in the area of injury prevention and management, there seems to be little attention to grounding this potential in biomechanical research linking quantities from wearables to musculoskeletal injuries, and to assessing the readiness of these biomechanical approaches for being implemented in real practice. We performed a systematic scoping review to characterise and critically analyse the state of the art of research using wearable technologies to study musculoskeletal injuries in sport from a biomechanical perspective. A total of 4952 articles were retrieved from the Web of Science, Scopus, and PubMed databases; 165 were included. Multiple study features—such as research design, scope, experimental settings, and applied context—were summarised and assessed. We also proposed an injury-research readiness classification tool to gauge the maturity of biomechanical approaches using wearables. Five main conclusions emerged from this review, which we used as a springboard to propose guidelines and good practices for future research and dissemination in the field.

Keywords: biomechanics; exercise; athlete; movement analysis; prevention; injury mechanisms; rehabilitation; accelerometer; inertial sensors; force transducers



Citation: Preatoni, E.; Bergamini, E.; Fantozzi, S.; Giraud, L.I.; Orejel Bustos, A.S.; Vannozzi, G.; Camomilla, V. The Use of Wearable Sensors for Preventing, Assessing, and Informing Recovery from Sport-Related Musculoskeletal Injuries: A Systematic Scoping Review. Sensors 2022, 22, 3225. https://doi.org/10.3390/s22093225

Academic Editor: Andrea Cataldo

Received: 9 March 2022 Accepted: 18 April 2022 Published: 22 April 2022

Publisher's Note: MDPI stays neutral with regard to jurisdictional claims in published maps and institutional affiliations.



Copyright: © 2022 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https://creativecommons.org/licenses/by/4.0/).

1. Introduction

Sport and physical exercise are increasingly promoted as part of a healthy lifestyle [1]. However, increased participation in physical activity and sport specialisation [2] may raise the risk of injury, especially in younger individuals [3], for whom sport-related accidents are a leading cause of medical attention and emergency department attendance [4–6]. The burden of sports injuries and their potential impact on quality of life and societal costs call for research and effective interventions in all of the areas associated with sports injury: prevention [3], assessment, and recovery [3,7].

Several strategies for the prevention of [8,9] and recovery from [7] injury have been proposed, alongside models of injury causation [10–12], classifications of injury factors

Sensors **2022**, 22, 3225 2 of 33

(e.g., intrinsic vs. extrinsic; modifiable vs. not modifiable) [13], and reviews of the different approaches that could be adopted to study injury mechanisms [12].

From a mechanical perspective, musculoskeletal injuries occur when the load applied to a tissue goes beyond the maximum amount of mechanical energy that bodily elements can accept without compromising their structure and function [14,15]. Several theories have been developed to explain the occurrence of injuries [11]; all recognise the complexity and multifactorial nature of injury causation, and distinguish between acute and overuse injuries. In acute events, the inciting energy exceeds the maximum tolerated by the tissues involved. In overuse injuries [16], the repetitive nature of the demands sustained by the body may reduce its tolerance levels to a point where normally acceptable loads can cause micro- or macro-failures. Repetitive submaximal microtraumas can lead to a cascade of alterations to structural proprieties, function, and behaviour, which eventually establish a vicious loop of degeneration, adaptation, and pain [17–19].

Biomechanical approaches can contribute substantially to the study of sports injuries and their prevention. For example, they can describe injury mechanisms and characterise inciting events, or can assess the effects of interventions on movement behaviours and the ability to withstand mechanical loads. Biomechanical tools also have the potential to help monitor compliance, quality, and progress of movement performance when an injury-prevention or return-to-activity programme is implemented [3,14,20]. In vivo, in vitro, and in silico methods have been used to quantify the biomechanical demands generated by sports actions [15], together with the responses of bodily tissues that are subjected to those loads. However, measuring mechanical quantities in real-world settings—either directly or indirectly—is extremely difficult, and sometimes impossible, because of ethical considerations and lack of adequate technology or sports regulations. In most cases, the assessment is confined to controlled lab conditions [21].

The ongoing development and increased use of wearable technologies, either in isolation or as part of integrated approaches, offers an opportunity to collect quantitative data "in the field", less obtrusively, for extended periods of time, and with fewer spatial limitations than conventional motion-capture technologies [22–46]. New-generation sensors are small, portable, minimally obtrusive, affordable, and easy to use; they may provide real-time feedback [36], as well as enable prospective studies on large cohorts [47].

Several review articles have assessed the use of such devices in different areas of sport science, when applied to the characterisation of sport-specific movements [22,24,34,40,42,45]; performance analysis and enhancement [23,26–28,44,46]; the evaluation of tactical variables [33,48]; the monitoring of load and inertial forces [29,30,37]; the trends and projections in the consumer sports sector [49]; the description of specific disciplines such as running [35,50], sprinting [27], swimming [28,51], combat sports [52], or Paralympic sports [26]; and the assessment of rehabilitative interventions [32,39]. Injury risk mitigation has been addressed within specific sport and injury domains, such as that of running-related injuries [35,36,39], head impacts [31], anterior cruciate ligament reconstruction [53–55], and dynamic stability in return to sport [41]. However, it appears that no work has systematically investigated the current state of the art on the role of wearable sensors in the different stages of injury assessment, including the characterisation of injury mechanisms, and the provision of information to support preventive or rehabilitative interventions.

The use of wearable sensors in movement science and sport is widespread; however, their application is still in an "exploratory phase" [22], and is not free from pitfalls [23,25,38], suggesting that both the technology and the associated methods still require further development and careful analysis [43]. Indeed, some of the features that make wearables attractive can also limit their applied impact. For example, the possibility to collect data continuously in an uncontrolled environment can generate the problem of handling large datasets affected by measurement noise, which generates the need for adequate awareness of data quality (e.g., prior validation, care in calibration procedures) and for the use of appropriate processing methods, such as machine learning, for key performance indicator estimates [56,57], or advanced data science techniques for data synthesis or

Sensors **2022**, 22, 3225 3 of 33

prediction [58]. Moreover, there is still little evidence on the causal relationships between specific biomechanical assessments, quantities derived thereof, and injury or injury risks [36,59,60], which can result in many studies being descriptive of the potential of new technologies rather than fully exploiting that potential to unveil the relationships between biomechanics (e.g., movement technique) and injury-related features (e.g., inciting factors, recovery status).

We present a systematic scoping review [61] on the use of wearable technologies for the study of musculoskeletal sports injuries, with the aim to discuss (a) the current literature contributing to the identification and description of the biomechanical factors and mechanisms associated with injury, as well as the biomechanical evaluation of preventive or rehabilitative interventions; (b) the strength of evidence brought about by the experimental approaches used by those studies; (c) the time setting in relation to injury, primary scope, and features of the experiments; and (d) the characteristics of the technologies and types of measures used. In analysing these items, we highlight strengths and weaknesses of the current state of the art, identify existing guidelines and common pitfalls, and discuss current trends and future directions. With a view to outlining the maturity of the research in the area and guiding initiatives aiming to fill existing gaps of knowledge, we also propose (e) a simple tool for the classification of biomechanical methods employing wearable technologies in the musculoskeletal injury area. This framework, which we called the Injury-research Readiness Level (IrRL), is inspired by the technology readiness level [62] and system readiness level [63] frameworks; it aims to capture the maturity, functionality, and environmental readiness of biomechanical approaches to be effectively deployed in the field.

2. Materials and Methods

2.1. Protocol, Search Strategy, and Inclusion Criteria

The PRISMA-ScR [64] framework guided the systematic scoping review, which was registered in PROSPERO (registration no. CRD42021140485) on 26 March 2021. Three main stages were followed to identify and filter studies: (1) definition of databases for article retrieval, search terms, and selection rules; (2) screening based on article titles and abstracts; and (3) final selection based on full-text examination (Section 3.1).

The literature search and management were conducted using *Covidence* [65]. The *Web of Science, Scopus*, and *PubMed* electronic databases were browsed up to 8 January 2021. Only peer-reviewed journal articles published in English were considered for inclusion, with no a priori removal based on study design or publication date. The search strategy was based on the PICOS tool [66], and search terms were chosen to scan the literature and identify studies that used wearable technology to perform biomechanical analyses of sports activities and contribute to the area of musculoskeletal injuries (see Table S1 in the Supplementary Materials for a full description of the Boolean search terms used).

Although no restriction was imposed on the types of technology used, we primarily focused our search terms on wearable magneto-inertial sensors and force or pressure transducers. Articles reporting exclusively on activity monitoring from global navigation satellite systems, injury surveillance without biomechanical measurements, metabolic behaviours (e.g., energy expenditure), or neuromuscular activity from electromyography were excluded. All levels of sport participation were accepted, but studies on clinical populations or not including human participants (e.g., with anthropomorphic test dummies or simulators) were excluded. Injuries affecting the nervous system, such as mild traumatic brain injuries, were not considered.

Items in Stage 1 were discussed and agreed by the whole group of authors. The reference list generated by the initial search, with titles and abstracts, was stored in *Covidence* and screened independently by two researchers (S.F. and G.V.), who identified additional relevant studies, eliminated duplicate sources, and then performed Stage 2 selection, reporting no disagreement. Review papers were initially considered to better analyse the wider context of the state of the art, but no review paper was included for more detailed analy-

Sensors **2022**, 22, 3225 4 of 33

sis past Stage 2, because they did not explicitly report original findings. For each article reaching Stage 3, the description of the relationship between biomechanical quantities and musculoskeletal injury was evaluated by two independent reviewers (E.B. and V.C.). Only articles directly investigating or making explicit reference to existing evidence of the relationship between the biomechanical quantities presented and musculoskeletal injury mechanisms or risk factors were included. Because of the large number of articles passing through to Stage 3, the final full-text examination was shared equally between authors, and weekly consensus meetings were held to discuss and resolve any uncertainty about the eligibility of a study. Summary statistics concerning journal and year of publication were reported, both in absolute terms (number of articles or articles per year), and normalised to the overall number of manuscripts published in the broader field of biomechanics of sport injuries. To estimate the normalising factors, we carried out a MeSH term search in PubMed, using the following query: ((sport[MeSH Terms]) AND (injury[MeSH Terms])) AND (biomechanics[MeSH Terms])), and then exporting values between 1968 (i.e., the first year available) and 2020.

2.2. Study Classification and Assessment

We assessed and reported on multiple feature domains of the studies selected (Table S2 in the Supplementary Materials): (1) strength of evidence, time setting, and primary scope; (2) study characterisation in terms of experimental conditions and setting, injury of interest, type and location, population tested, type of sport and motor task, and level of sporting participation; and (3) characteristics of the technologies and types of wearable device and measures used. We also defined and assessed (4) the injury-research readiness level (IrRL).

2.2.1. Strength of Evidence, Time Setting, and Scope

Two independent researchers (L.G. and E.P.) assessed the strength of evidence of each article and assigned them to three main categories in decreasing order of strength, based on the experimental design used: experimental, i.e., meeting the requirements of randomised controlled trials; quasi-experimental, i.e., including a manipulation of the experimental conditions under which participants perform sport, but lacking random assignment or group comparison; and observational, i.e., without assessing the effects of an intervention, and only describing participant behaviour [67]. A separate class was used for studies looking exclusively at the validation of new equipment or methods. The opportunity to use a finer classification of observational studies (e.g., cross-sectional, case-control, cohort, case series) and include the assessment of the risk of bias of individual studies [67,68] was considered. However, given the scoping nature of the review, and in light of the large extent of literature covered by the topic, and of the variety of outcome measures and experimental approaches, we deemed this impractical and unnecessary. Indeed, our review aimed at characterising the current state of the art in a specific area of sports biomechanics and, thus, did not require formalisation of a specific experimental question, nor assessment of the quality of the studies attempting to answer such a question [61].

A pre/at/post classification was used to express the chronological relationship between the experimental data collected and the injuries studied. Studies were classified as pre if data were collected without any injury occurring, or without a direct attempt to establish a causal relationship between biomechanics and injury. These studies typically relied on findings from the existing literature to construct their rationale and hypothesis, and then discussed injury prevention implications starting from those assumptions. Articles were allocated to the at category if the scope of the experiment was to identify and characterise injury factors or mechanisms, and therefore attempted to capture or track injury occurrences (e.g., cohort studies with biomechanical screening and in-field injury events recorded during a sports season). It should be noted that these studies did not necessarily use wearables to identify, count, or depict injury events. Lastly, studies were recorded as post if data collection was performed after the injurious event, during the recovery phase, and aimed to advise rehabilitation and reduce the likelihood of injury reoccurrence. For clarity,

Sensors **2022**, 22, 3225 5 of 33

articles on participants who had already returned to full activity (e.g., comparisons between healthy individuals and people with a history of a specific musculoskeletal problem) were classified as *pre*, because they were not centred on the recovery process that goes from injury occurrence (or medical intervention, if relevant) to being able to return to full activity.

The classification according to the primary scope was carried out based on the following categories: studies analysing sport-related injury mechanisms; studies assessing sport-related injury factors or injury risks; studies attempting to establish injury threshold criteria from a mechanical perspective; studies characterising protective devices; and studies focusing on post-injury monitoring or return-to-play assessment. Validation studies were classified according to the primary aim for which the method or tool tested had been devised, as stated by the authors. Articles addressing multiple issues were reported in more than one category, where appropriate.

2.2.2. Study Characterisation

To describe experimental conditions, we extracted information about the settings in which data were collected, i.e., laboratory- vs. field-based. Specifically, studies were labelled as field-based if data were acquired during training, simulated training, or competition in a sport-specific setting. Conversely, investigations carried out within a laboratory, or in the field but using instrumentation typically adopted in the laboratory—such as obtrusive motion-capture setups or force platforms—were labelled as laboratory-based.

The injuries addressed by the works reviewed were classified as caused by overuse or acute events [16], and listed by the tissue affected (soft vs. skeletal) and body location. Furthermore, we annotated the type of sport and motor task addressed by each study and the level of sport participation of the people partaking in the tests (i.e., sedentary, recreationally active, trained/developmental, highly trained/national level, elite/international, world-class, or not specified/insufficient data to be classified) [69].

2.2.3. Technical Features and Validation

The following features were taken into account when discussing wearable devices: type of measurement system (e.g., accelerometer, gyroscope, magnetometer, force or pressure transducers); brand; physical and technical characteristics (e.g., mass, dimension, full-scale capacity, resolution, buffer, voltage sensitivity, sampling frequency); number of units used to collect data; locations (on body segments or equipment); and fixing technique (e.g., pocket in a vest/belt/tape, bi-adhesive on the skin, tape, elastic strap, rigid frame). We also reported on the quantities measured via wearable sensors being essential (i.e., primary outcome), complementary (i.e., part of the analysis but not fundamental), or marginal (i.e., used for other experimental needs, e.g., equipment synchronisation) for answering the research questions, as well as the information reported about previous validations of the measurement used.

2.2.4. Injury-Research Readiness Level

Building on the system readiness level (SRL, [63]) framework, we modelled the Injury-research Readiness Level (IrRL) to capture the maturity, functionality, and environmental readiness of the studies aiming to contribute to preventing, assessing, or recovering from sport-related musculoskeletal injuries. According to the SRL model, technology and system development follow similar maturation paths, whereby technology is inserted into a system and interacts with it via a proposed architecture. Knowing about the system components and their integration [70] is essential, and this knowledge allows a classification of the system as being in its research, development, or deployment stage.

In the context of research on sport-related injuries, we propose that a method is deemed mature for deployment only when it relies on measuring tools that are characterised by high ecological validity (i.e., fully wearable and unobtrusive or markerless), can be applied directly in the field, and is supported by validation studies against an established gold standard or, when validation is not practicable (e.g., tibial peak accelerations), adheres to

Sensors **2022**, 22, 3225 6 of 33

standardised experimental procedures. Moreover, the approach must be integrated into a testing scenario to justify its validity for preventing, assessing, or informing the recovery from injury. Specifically, the biomechanical quantities used should demonstrate evidence of a causal relationship with the investigated injury, and their interpretation should be driven by specific guidelines (e.g., individual- or population-based normative boundaries, thresholds, or trends). Therefore, we defined and used the following classification (Figure 1):

- IrRL1—research studies not relying on established causal relationships or set guidelines, but rather aiming to find and demonstrate them;
- IrRL2—studies progressing knowledge and building upon demonstrated causal relationships, either in a laboratory or in the field, possibly complementing wearables with lab-based instrumentation;
- IrRL3—studies in which the proposed methods and/or findings are ready for field-based deployment, do not rely on any lab-based or obtrusive technology undermining ecological validity, and use or formalise specific guidelines; the measures indicated as relevant for the study of a specific injury have also been demonstrated to have a causal relationship with the injury itself.

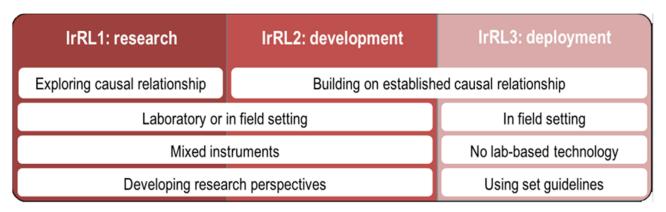


Figure 1. The injury-research readiness level classification model, where different classes of research maturity (IrRL1-3, in columns) are mapped against the following feature domains (rows): knowledge of causal relationship, experimental settings, testing technology, and normative guidelines.

3. Results and Discussion

3.1. Article Selection and Identification

The screening process (Figure 2) started from 4952 potentially relevant articles, retrieved from the three main databases accessed (Scopus = 2263; Web of Science = 1624; PubMed = 1065). After removing 1538 duplicate items, 3180 publications were excluded based on title and abstract, leaving 234 manuscripts for full-text examination. Discussion in weekly consensus meetings led to a further 77 articles being discarded (most frequent reasons: not including wearables; not including human participants or sport-related activities; and not describing the relationship between biomechanical quantities from wearables and musculoskeletal injury, or not citing references to support that link) and the addition of 8 relevant records from other sources, yielding a total of 165 studies to be considered for the review (Table S2 in the Supplementary Materials) [47,71–234].

Sensors **2022**, 22, 3225 7 of 33

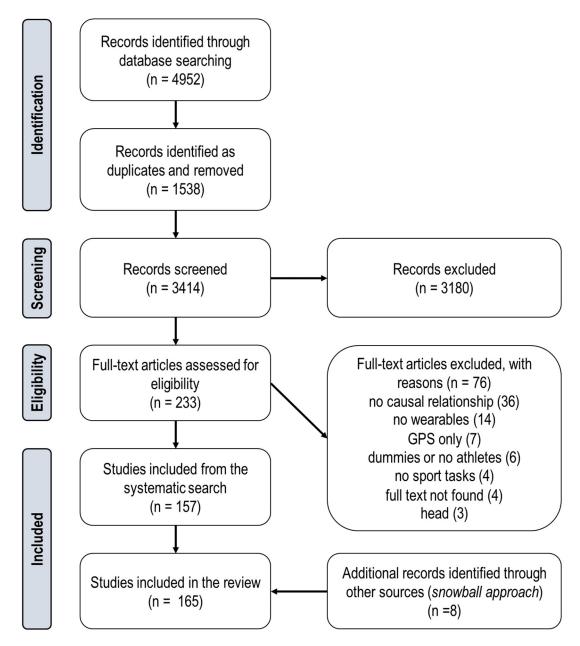


Figure 2. The PRISMA-ScR flowchart, showing the search and selection process.

Fifty-five percent of the included studies either aimed to establish a relationship between biomechanical quantities and injury (~14%), or included (typically in the introduction) an explanation of this connection by building on evidence from the existing literature (~41%). The remaining 45% did not openly discuss the link between the measures they used and the associated injury, but only mentioned such relationships as possible or hypothetical, citing previous research to justify their choices (Table S2: causal relationship). It therefore appears that nearly half of the studies meeting the primary inclusion criteria and using biomechanical quantities from wearable technologies in the wider context of musculoskeletal sport-related injuries were partly speculative in the construction of their rationale. Indeed, these studies often justified the choice of their measurements by briefly citing the work of other authors, but without discussing the strength of evidence from the previous literature, and rather accepting it even when only hypothetical. Building on robust evidence of the association between specific tests, measures derived thereof, and injury, or trying to establish this relationship, should instead be the starting point for any research in this area, and the basis upon which further evidence is built. This is a crucial element

Sensors **2022**, 22, 3225 8 of 33

that is not adequately addressed in many of the works scrutinised, and should be better promoted in the design of research programmes and checked during manuscript reviews.

3.2. Journals and Years

The 165 original manuscripts included in the scoping review appeared in 60 different journals, with 11 journals publishing nearly half of the total, and at least 5 relevant articles each (Table S2: journal). The number of articles in the area under scrutiny appears to increase over time (Figure 3), even when publication numbers are normalised to the total of articles published every year in the broader domain of biomechanics of sports injuries. The use of wearables in the area of musculoskeletal sports injuries seems to be increasing in popularity, as also demonstrated by the 22 review papers published between 2011 and January 2021 (Figure 3).

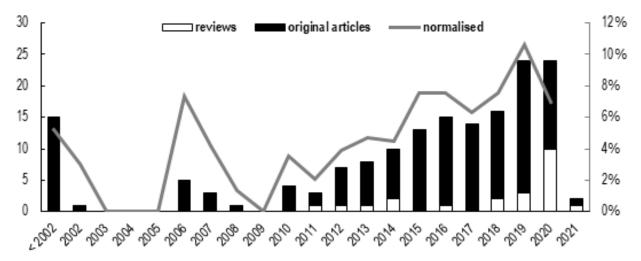


Figure 3. Time distribution of the original studies selected for this scoping review (black), and reviews (white), ordered by publication year. The graph also reports the number of original articles published, normalised (%) to the overall number of manuscripts published in the same year in the broader area of sport injury biomechanics, where this quantity was retrieved using the following MeSH term search in PubMed: ((sport[MeSH Terms]) AND (injury[MeSH Terms])).

3.3. Study Classification and Assessment

3.3.1. Strength of Evidence, Time Setting, and Scope

More than half of the 165 studies scrutinised were observational (96, 58.2%), 51 were quasi-experimental (30.9%), and none could be classified as fully experimental. About 10% (18) attempted validating new methods or protocols against existing standards. Most of the investigations (137, 83%) were at the *pre* stage (44.8% observational, 30.9% quasi-experimental, and 7.3% validation). Considerably fewer (24, 14.5%) attempted to capture actual injuries and could be classified in the *at* group (12.7% observational, 1.8% validation), and only four (2.4%) directly addressed the injury recovery stage and were allocated to the *post* category (0.6% observational, 1.8% validation) (Figure 4 and Table S2: strength of evidence, time setting). The primary focus of the reviewed literature was assessing sport-related injury factors or injury risk in a large majority of studies (124 out of 165), followed by characterising protective devices (15), analysing sport-related injury mechanisms, and gait retraining (11 items each). Few articles addressed post-injury monitoring or return-to-play assessment (4), or attempted to establish injury threshold criteria (2). Two had multiple focuses (Table S2: scope).

Sensors **2022**, 22, 3225 9 of 33

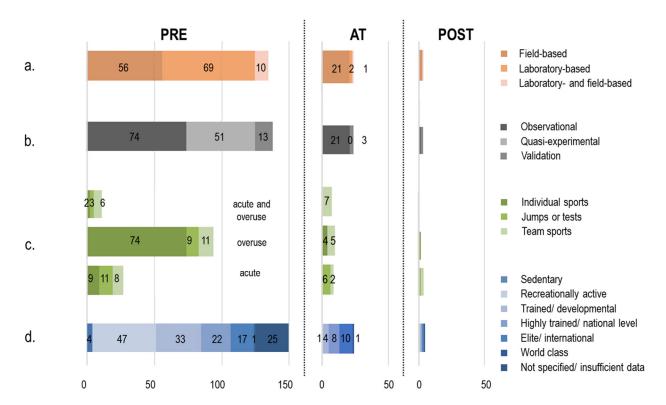


Figure 4. The distribution of studies at different time settings in relation to injury, reported from different perspectives: (a) experimental setting; (b) strength of evidence; (c) injury type; (d) level of sport participation. Multiple counts are allowed for injury type and level of sports, since some articles analysed multiple types of injuries and/or tested athletes at different levels of sport.

Of the 24 retrieved articles classified as at (i.e., observing actual injuries as part of the experimental protocol), a majority (54%) focused on workload metrics [75,100,104,126,150,151,160,175,189,197,202,203,234], and often used inertial measurement units (IMUs) to complement information coming from other sources (e.g., global positioning systems, RPE scales). Six articles (25%) adopted a baseline screening approach, whereby biomechanical tests were followed up with injury surveillance over a relatively long period (1 year/season or longer) [47,76,97,143,204]. Only two works—both analysing running—looked into the short-term association between biomechanical quantities and running-related injuries [117] or biomarkers of muscle and kidney injury [232]. Similarly, but only discussing the experimental protocol for a prospective cohort study, one study [118] aimed to use wearables to inform training personalisation and reduce the risk of hamstring injuries in soccer. The only return-to-sport (i.e., post) article retrieved [228] that was not a validation study used a single IMU located on the lumbar spine to monitor the recovery from hamstring injury of a single professional soccer player. This case report observed force-velocity interlimb differences, and discussed the sensitivity of the reported metrics in relation to the phase of the competitive season and the occurrence of the injury.

Bringing together the outcomes related to timing with respect to injury, the design of the experiments, and their scope, it appears that currently (a) there is no field-based investigation attempting to detect and capture musculoskeletal injury mechanisms through wearables; (b) there exists little research that exploits wearable technologies to characterise movement behaviours associated with musculoskeletal injuries; and (c) the strength of evidence brought about by the literature is generally not high. As a consequence, a large proportion of studies appear to rely on previous works to discuss injury factors and compare movement behaviours in different groups of participants, but do not directly characterise nor even observe injuries within their experiments. Unfortunately, as outlined in Section 3.1, nearly half of these works—with an even higher prevalence in the *pre* class—did not discuss

Sensors **2022**, 22, 3225 10 of 33

the validity of the studies they cited to construct their rationale, which in turn affects the validity of their findings and makes them appear more as exploratory investigations of the potential of methods and technologies, rather than as a substantial means to progress knowledge and generate impact on injury factors, mechanisms, or the effectiveness of interventions. For example, amongst the quasi-experimental studies that investigated the effects of interventions, only 29 out of 51 (~56%) (Table S2: causal relationship) clearly introduced the existing evidence of the relationship between the biomechanical quantities chosen as outcome measures and the musculoskeletal injury addressed.

3.3.2. Study Characterisation Experimental Setting

Field-based studies analysing athletes during training, simulated training, or competitions comprised 79 (48%) of the total reviewed, whereas 71 (43%) investigations were performed in laboratory settings; 12 (7%) articles included both settings, and 3 (2%) did not provide enough information to understand where the study was performed (Table S2: setting).

No clear difference was observed in terms of scope between field- and laboratory-based investigations (Table S2: scope), with the majority focusing on the assessment of injury factors (60 (76%) of the field-based and 51 (72%) of the lab-based studies). The remaining laboratory-based studies focused on characterising protective devices (9), primarily in running (5) and basketball (3), gait retraining (8), and understanding running-related injury mechanisms (3). Interestingly, only one of the works dealing with gait retraining was field-based, which may be partly explained by the need to integrate wearable sensors with other equipment (e.g., instrumented treadmill, force plates) and with a pre- vs. post-intervention design relying on ad hoc lab-based sessions. The other field-based studies aimed at understanding sport-related injury mechanisms (8) and characterising protective devices (5) in a large variety of sports disciplines (both individual and team sports), with three studies focusing on post-injury monitoring, and two on setting injury threshold criteria.

When considering the different sport activities (Table S2: sport), 58% of studies performed in laboratory settings focused primarily on running (41), 19 included other individual sports, and only 11 addressed team sport situations. Conversely, field-based investigations considered a wider spectrum of sports, with 43 of them analysing team sports (i.e., soccer, American football, rugby, baseball, Australian football, basketball, handball, and volleyball), 16 on running, and 20 including other individual activities, with a prevalence of winter sports (8 studies out of 11). Studies including both settings primarily focused on running (7 studies out of 15), and the remainder were equally distributed between team and individual sports (4 each).

In 81% (64) of field-based studies, wearable devices were used as the exclusive means to answer the primary research question, or were in any case essential when used in combination with other instrumentation. Conversely, laboratory-based studies were less reliant on wearable technologies, which were classified as essential in only 33 (46%) of them (Table S2: role of IMU-based measurement).

When taking into account the type of injury investigated (Table S2: injury type, tissue affected and body region), in relation to the experimental setting, 79% of laboratory-based studies considered overuse injuries (56), and 83% of them (59) were about lower-limb injuries. Only a few laboratory-based studies focused on upper limbs or spine-related injuries (4 and 5, respectively). Three studies did not provide any information about the type and location of the investigated injury. On the other hand, 39% of field-based investigations addressed acute injuries (31), while 61% looked at overuse injuries (48) and considered a wider variety of injury locations. About half of the articles focused on the lower limbs (38), 14 on the spine, and 9 on the upper limbs. Interestingly, 10 (13%) field-based investigations did not consider a specific body area but, rather, analysed injuries in any body region during rugby, American football, soccer, and volleyball competitions. The remaining eight field-based studies did not specify the type and location of the investigated injury.

Sensors **2022**, 22, 3225 11 of 33

Injury Type and Location

The majority of the studies focused on overuse injuries (105, 64%), most of which were located in the lower limbs (65) and the spine (17) (Figure 5a). Acute injuries were addressed in 42 (25%) of the investigations, with a net prevalence of knee (14), ankle (7), and general lower-limb injuries (10) (Figure 5b). The remaining 18 (11%) articles included both acute and overuse injuries primarily related to the lower limbs (6) or any body location (8) (Table S2: injury type and body region).

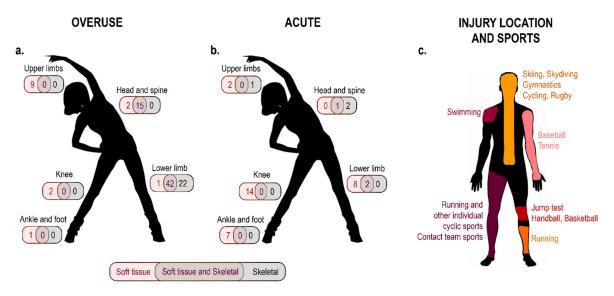


Figure 5. (a,b) Breakdown of studies (absolute number) by injury location (i.e., ankle and foot, knee, lower limb, head and spine, upper limb), tissue affected (i.e., soft or skeletal), and injury type (acute or overuse). Articles in which the body region was not specified, or considering any injury location, along with articles including both acute and overuse injuries, are not reported in the figure (34 studies in total). (c) Body map showing injury location and the associated sports disciplines for which there is prevalence of published research in the areas considered by this review.

When considering the type of tissue affected (Table S2: tissue affected), 55 studies (33%) focused on soft-tissue injuries and, among them, 32 were acute, 16 were overuse, and the remaining 7 included both types of injury. Among studies focusing on acute soft-tissue injuries, more than half targeted anterior cruciate ligament tears (12) and ankle sprains (6). Only 25 works out of 165 (15%) considered skeletal injuries, of which a large majority (21) were classified as overuse, and were about stress tibial fractures in running. The rest of the studies (85, 52%) either considered both types of tissues (82) or did not explicitly specify the type of tissue considered (3). Interestingly, about half of the investigations including both soft-tissue and skeletal injuries were on running (38), and used the definition of "running related injury" to refer to them. Running-related injuries were typically described as overuse injuries affecting both soft and skeletal tissues, and located in the lower limbs or, in some cases, the spine.

Acute injuries were investigated primarily in contact team sports (26) or jump/performance tests (12), whereas overuse injuries were observed more during running (63), and in both team and individual sports (42) (e.g., baseball, basketball, volleyball, tennis, cycling, fencing, skating, and skiing). Almost all articles dealing with contact sports (43 out of 48, 90%) focused either on soft-tissue or both soft and skeletal tissue injuries in the lower limbs or at any body region. On the other hand, 96% of studies considering cyclic sports (70 out of 73) analysed overuse leg- (64 dealing with stress tibial fracture) or spine-related (6) injuries. A total of 16 studies out of the 165 reviewed (10%) explicitly dealt with knee injury. All of them considered soft-tissue injuries, and the large majority focused on anterior cruciate ligament tears (12). Only 13 articles focused on upper-limb injuries. Soft-tissue shoulder, elbow, or wrist injuries were considered in studies dealing with baseball (7),

Sensors **2022**, 22, 3225

tennis (4), and swimming (2). Only one study focused on skeletal injury in the wrist during snowboarding. Finally, vertebral or spine injuries, either in soft or skeletal tissues, were investigated in 22 studies (13%) dealing with different disciplines such as skiing, skydiving, gymnastics, cycling, and rugby (Figure 5c).

Population

Ten articles tested multiple types of cohorts (Table S2: participants level of sport, participants number, participants injury history). Over the total of 178 cohorts tested, the majority of articles included in this review analysed recreationally active athletes (28%) and trained/developmental athletes (21%), with highly trained/national level, elite/international, and world-class athletes in 17%, 16%, and 1% of them, respectively. A considerable portion (15%) of works did not specify the level of sport participation.

A grand total of 4674 healthy (747 females, 2874 males, 1053 without description of their gender) and 365 injured (46 females, 41 males, 284 without description) athletes were studied across the 165 reviewed works (Figure 6a). A large majority (75%) of the articles studied fewer than 30 participants (median for the grand total: 17 healthy and 8 athletes post-injury), and as few as 22 studies with a sample size from 46 to 432 (median of these 22 studies: 80 athletes) accounted for half of the overall number of participants assessed (Figure 6b). Eight of these 22 investigations tallied up a total of 770 runners of both genders [47,103,124,182,195,209,214,230], whilst 13 studies analysed 1639 male and 70 female players practicing team sports (i.e., basketball [71], American football [104,118,213,234], soccer [185,191], Australian football [160,202], baseball [94,178], and rugby [81,179]) (Figure 6c). These articles on team sports primarily generated the larger prevalence of male athletes in the overall sample analysed in our review. Many articles studying male-dominated team sports did not explicitly specify the gender of their participants; making an implicit assumption that the participants were males would cause an even more unbalanced distribution in the current numbers of male and female populations analysed in the existing literature.

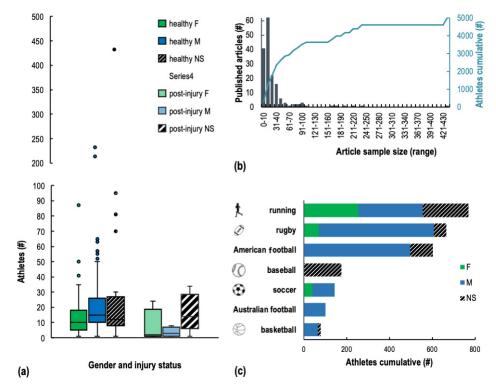


Figure 6. (a) Boxplot of healthy and post-injury athletes divided by gender. (b) Left: number of athletes analysed in groups of the sample size reported in abscissa; right: their cumulative value. (c) Number of athletes, divided by gender, tested in the sports analysed in the 21 studies comprising half of the overall sample of this review (F = females, M = males, NS = gender not specified).

Sensors **2022**, 22, 3225 13 of 33

Sport and Task

Cyclic and team sports comprised 43% and 36% of the studies analysed, respectively (Figure 7). Winter and racquet sports as well as motor-capacity testing and non-cyclical individual sports all yielded a similar share of interest (5–6%) (Table S2: sport).

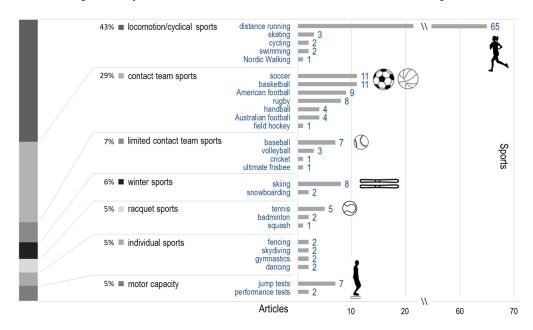


Figure 7. Breakdown of published articles by sport and motor task. Multiple counts are allowed for articles performing comparative studies across sports.

The specific motor tasks investigated covered a wide spectrum of gross motor skills (Tables 1 and S2: motor-task), in many cases with a special focus on tasks more frequently associated with injury events, such as lateral shuffling and sidestep cutting manoeuvres, landing actions with one or two legs, tackling and sustaining physical collisions, overarm throwing, actions simulating injury mechanisms, or sport-specific actions in a variety of disciplines. Articles also focused on actions commonly used in both static (for flexibility, balance, joint mobility, and muscle strength) and dynamic tests.

3.3.3. Technical Features and Validation

Most of the reviewed studies (161, 98%) used inertial sensors, with 104 (63%) employing only 1D or 3D accelerometers, 16 (10%) integrating measures of the accelerometer with those from the gyroscope, and 15 (9%) adding both gyroscope and magnetometer measurements. In three studies (2%), 1D or 3D gyroscopes were used in isolation (Table S2: device type). Nine articles stated that they used IMUs, but did not provide enough information to establish the type of the sensors embedded in the IMU, nor which transducers were used in their investigation. A large majority of articles (75, 45%) did not report any technical information about the technology employed (e.g., mass, dimension, full scale capacity, resolution, buffer, voltage sensitivity; Table S2: device characteristics). In 23 studies (14%), the authors did not even report the sampling frequency at which their sensors were operating (Table S2: device sampling frequency). In the remaining 47 works (28%) describing these specifications, the full-scale capacity of the accelerometers spanned between 6 and 500 g. Thirty (18%) articles reported a full scale for linear accelerations of \leq 50 g, whereas most of the gyroscopes reached a maximum of 2000 deg/s for angular velocities.

Sensors **2022**, 22, 3225 14 of 33

Table 1. Breakdown of motor tasks investigated, classified by different gross motor skills or aims of the motor task.

Locomotion	Agility runs (lateral shuffling and sidestep cutting manoeuvres); Bicycling (road climb and single-track climb, downhill); Jumping (vertical drop jump, landing with one or two legs, countermovement jump, standing long jump, double-legged hops, rebound jumps, single-leg drift jump); Skating (short-track speed, treadmill inline); Running (overground, trail and treadmill, level/uphill/downhill, outdoor distance running, jogging, Nordic walking, walking); Skiing and snowboarding (alpine skiing, ski jumping, carved turns); Gymnastics routines (back walkover and back handsprings); Swimming (freestyle); Sport-specific actions: rugby, soccer matches and training sessions, volleyball, baseball, basketball, American and Australian football tasks, flamenco, ballet dance steps	
Accelerating or decelerating masses	Tackling and sustaining physical collisions (scrummaging, shoulder charge tackles, strikes, hit-ups and impacts/ collisions)	
Throwing or hitting	Overarm movements (tennis serve/one-hand or backhand drive, pitching, cricket bowling, baseball and volleyball throws and serves); Sidearm movements (fencing lunge)	
Simulating injury mechanisms	Ankle sprain motion; Falls	
Testing	Static tests for flexibility, balance, joint mobility, and muscle strengtl (single-limb stance, modified Star Excursion Balance Test, lunge, sit Testing and-reach, adductor squeeze, planar and multiplanar single-leg hoppir Dynamic tests (shuttle run, sidestep, change of direction and accelerati agility T-Test, drills designed to reflect the mechanism of ankle sprain inju	

The most popular commercial systems were Xsens (MVN suit, MTx Sensor, and Awinda; Xsens Technologies B.V., Enschede, The Netherlands) and Catapult (MinimaxX, including all the different versions produced, and OptymEye; Catapult Innovations, Melbourne, Australia), followed by Physilog (Gait Up, Lausanne, CH, Switzerland), Noraxon (Scottsdale, AZ, USA), and Motus Global (Rockville Centre, NY, USA) (Table S2: device brand). In 49 (30%) studies, custom-made or general-purpose devices were adopted, and in 28 (17%) no information was reported about the transducers employed. Little research used pressure (12, 7%) or force (3, 2%) transducers; in some cases (7, 4%), pressure sensors were combined with inertial units. The commercial systems used for pressure and force measurements were mainly produced by Novel (München, Deutschland) and Kistler (Winterthur, Switzerland).

In 152 studies (93%), sensors were attached directly to the athlete's body (Table S2: device number of units): 85 (52%) employed a single-sensor configuration, 53 (32%) used between 2 and 5 sensors, and 10 (6%) utilised more than 5 devices. The tibia was the most popular location (80, 48%), followed by the pelvis (43, 26%) and the trunk (40, 24%) (Table S2: device position). In many articles, the description of body location where the device was placed was too vague to understand the point within the body segment area (e.g., "thigh", "shank", "chest", "upper arm"). Various practices were observed in terms of methods to secure the measuring unit, which also depended on the area of attachment (Table S2: device fixing technique); a lodging pocket was more frequently used for the upper trunk and arm, whereas no preferred fixing technique emerged for tibia and head locations (Figure 8). In 27 studies, the sensors were embedded in or attached to the equipment used (e.g., shoes, tennis racket, boot, ski, bicycle, barbell bar). This was done with glue or tape, or by inserting the transducers into the device, such as for shoe insoles.

Sensors 2022, 22, 3225 15 of 33

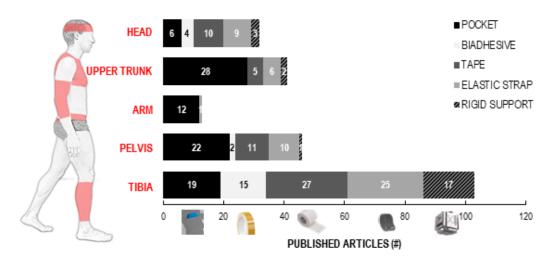


Figure 8. The most used body positions (head, trunk, arm, pelvis, and tibia) and the associated methods of sensor attachment (pocket in a vest/belt/tape, double-side tape directly on the skin, tape above the sensor, elastic strap, and rigid frame). The numbers represent how many studies implemented that type of sensor attachment for each specific location.

Although describing the technical features of the sensor is key to the correct interpretation of data quality and of the meaningfulness of the changes that an intervention may induce, most studies did not report this information in enough detail. As highlighted by recent systematic reviews on inertial sensors for sport performance evaluation [23], and on accelerometry of impact loading in runners [35], reporting the features of the wearable device used—as well as information on the attachment location and fixing methods—is essential.

The sampling frequency should be chosen considering the features of the signal captured and of the noise superimposed. For instance, 99% of the tibial acceleration power during running is below 60 Hz, which led Sheerin et al. [35] to suggest that the sampling frequency of running-related quantities from wearables should be between 300 and 600 Hz. Similarly, it is essential to select the appropriate filtering frequencies, as incorrect filtering can lead to inaccurate interpretation of data [35].

The dimensions, mass, and fixing technique of the sensor should be evaluated in the context of the motor task under analysis and the physical quantities of interest. For sport evaluation in general [23], (1) fixing that restricts the range of movement should be avoided, (2) movement between body segments and sensors should be limited by securing them firmly, (3) the use of elastic belts is not recommended for tasks entailing impacts, and (4) areas close to joints and with soft tissues "wobbling" should be avoided. More specifically, in running [35], (1) a measuring unit with an integrated accelerometer, gyroscope, and magnetometer has higher mass and, thus, the estimation of tibial acceleration is less accurate; (2) measurement error is influenced by the interface between the transducer and the accelerometer-mounting system, where the preload generated by straps or tapes influences the signal (e.g., the tensioning "as much as tolerable" is operator- and participant-dependent). Inserting the sensor in a specially designed pocket of a sport garment is a frequently used solution, which offers an ecologically valid and easily accessible attachment, even in competition settings. However, the use of a pocket may be suboptimal in terms of creating an acceptable attachment of the unit to the participant's body, and could cause excessive movement artefacts, especially with highly dynamic movements.

Twelve articles in this review contributed to reinforcing the body of methodological guidelines for data acquisition to better capture the content of relevance for risk evaluation. For example, the position and alignment within the body segment, together with the number of measurement axes of the sensor, were found to influence the quality of the investigation for running analysis. (1) Tibial accelerations occur along three directions, and measurements limited to one or two axes may misrepresent the mechanics of the phenomenon [209,235] which, in addition to the calculation of vertical stiffness [144], gen-

Sensors **2022**, 22, 3225 16 of 33

erally support the use of the resultant acceleration as a quantity less sensitive to alignment problems [209]. (2) Proximal tibial attachments lead to outcomes that are not comparable to those derived from distal locations, due to the influence of the tibial angular velocity and the distance of the device from the ankle [109]. (3) Similarly, shoe-mounted sensors measure higher peak positive accelerations, and are less related to vertical loading rates compared to shank-mounted devices, suggesting that they should not be relied upon if the aim is to monitor modulations of loading rates with changes in running technique (typical of gait retraining) [165]. The comparison of outcomes of known importance for injury research between lab- and field-based conditions highlighted the importance of a research setting specific to the application, suggesting that certain lab constraints may not be appropriate to investigate field-based injuries (e.g., higher intensity of cutting tasks in real games compared to lab-based tests [218]; higher accelerations peaks in field-compared to lab-based running [87]). Findings support measuring tibial impact acceleration in a natural, outdoor environment [124] and, since fatigue may contribute to altering behaviour and variables with time, call for the development of thresholds associated with an increased likelihood of injuries that are specific to field-based conditions [87]. Other specificity concerns have been raised for the interpretation of research results; sex-specific running injuries require sex-specific monitoring to reduce injury risk [47], and differences in sports collisions require sport-specific tackling detection systems [142].

Reporting on the validation of the measurements used, or at least referring to former studies discussing the validity of the approach taken, appears to be relatively widespread (81% of the studies) (Table 2 and Table S2: assessment of measurement quality). However, a considerable portion of the reviewed literature (29 articles, 19%) did not explicitly refer to former validations of the measuring systems and the protocols used within their experiments, or did not assess the absolute and relative repeatability of the measures collected (64, 39%).

Table 2. Breakdown of approaches used for sensor validation.

Perform sensors' validation within the cited article (22)		Compared to gold standards (e.g., stereophotogrammetry, force platforms, high-speed video, or photocells) (16); Comparing classification results against human\validated software classification (6).
Perform pilot studies (8)		Improving fixing or accuracy;
Refer to former validation studies (42)		Referring to accuracy and/or reliability of the same sensors as obtained in other validation studies.
Refer to ad hoc procedures for the performed measures (64)		Describing procedures for tibial acceleration or shock propagation measures (48); Referring to procedures other than tibial shock in the literature (6); Referring to international ISO standards (3); Referring to vendors' procedures (6).

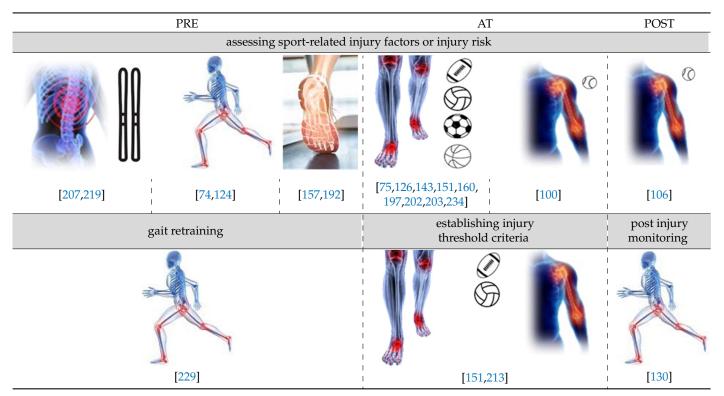
3.3.4. Injury-Research Readiness Level

The classification of the articles according to the proposed injury-research readiness level framework identified 75 studies at the *research* level (IrRL1), 70 at the *development* level (IrRL2), and only 20 ready for field-based *deployment* (IrRL3) (Table S2: IrRL). Among the IrRL3 works, few articles (3) fully exploited the potential of biomechanics to detect increased risk of injury (setting injury thresholds [151,213]) or to monitor the effect of interventions (return to play [106]), and none investigated the biomechanics of injury mechanisms.

Sensors **2022**, 22, 3225 17 of 33

Of the 20 articles at the *deployment* level (IrRL3) (Table 3), 8 were *pre*, 11 captured real injuries (i.e., classified as *at*), and 1 dealt with return to sport (*post*), forming a time setting distribution that was notably different from that of the overall sample (83%, 14.5%, and 2.4%, respectively). This is consistent with the definition of the *deployment* stage, which requires the ability to perform field-based measures without lab-based technology, to build on established causal relationships between measures and injury mechanisms or risk factors, and to use set guidelines. These requirements are particularly important in the *at* stage, to be able to capture an increase in injury risk at the time of occurrence [75,100,126,143,151,160,197,202,203,213,234], and to guide return to sport *post*-injury based on appropriate biomechanical quantities [106].

Table 3. Studies at the *deployment* level (IrRL3), divided by time setting and scope. Icons represent the body region related to the injury and the sport involved.



Research at IrRL1 is fundamental to identify the cause—consequence relationship between biomechanical factors and injury, which represents the foundations to transition from IrRL1 to IrRL2. Using or establishing guidelines is one of the three key aspects for a study to move from IrRL2 to IrRL3. Within IrRL3, only two articles used or established normative bands or injury threshold criteria. They identified the following quantities as a measure of risk: (1) internal and external training load, provided by accelerometry measures, and perceived wellness, for muscle damage in volleyball players [151]; and (2) symmetry of the region of limb stability (ROLS) for lower-limb injuries of collegiate football players [213]. The potential of these quantities as preventive tools within a surveillance system remains to be assessed. Nine other articles assessing sport-related risk of injury/predictive factors have been building knowledge in this direction, although not providing thresholds:

1. Global navigation satellite systems and accelerometry quantities have been used to obtain workload measures that, despite being widely cited in injury-prevention research, are still considered controversial [23,236–239]—especially in relation to the ratio between acute and chronic workloads. Daily monitoring of several load-related measures, such as player load—both internal and external—and its variability has been suggested for different sports (i.e., American football [203,234], Australian

Sensors **2022**, 22, 3225 18 of 33

football [160], baseball [100], soccer [126,197], volleyball [151]), alongside overuse complaints [151] and wellness monitoring to understand the effect of training workloads on injury (American football [75]). Providing individual risk estimates on a daily basis could support practitioners to take better informed decisions while balancing the need to minimize injury risk and maximize athletic performance (Australian football [202]). Similar accelerometry parameters have also been used to describe *whole-body vibrations* to investigate their severity and transmissibility from the skis to the lower back and to the head for different skiing disciplines [207,219].

2. Symmetry reduction has been investigated as a measure of potential risk for lower-limb injuries. Baseline values were analysed in relation to injury history to characterise the region of limb stability, during single-limb stance of basketball players (construct validation [143]).

Many IrRL3 articles contributed to guideline finalisation, providing specific indications of how to assess and use data for monitoring and personalising feedback to prevent injuries or to guide rehabilitation. Running studies at the *deployment* level have typically focused on crucial factors for the assessment of loading capacity and joint stability, including the type of running (treadmill vs. real-word running [124]), running surface [192], and level of fatigue [74]. Baseline values have been obtained for ankle-specific biomechanical measures in runners, in relation to their chronic ankle instability history [157]. Some contributions have focused on developing instruments for personalised feedback with ecological equipment, such as haptic feedback for gait retraining to reduce runners' tibial acceleration [229], or radar guns to modulate throwing intensity and protect the reconstructed elbow from excess medial torque during rehabilitation [106].

Zooming out to the three readiness levels (Figure 9), it can be noted that validation studies were mainly classified as being at the *research* level, quasi-experimental and observational studies were more equally distributed between the *research* and *development* levels, and observational studies were the most common design at the *deployment* level (Figure 9a). Studies aiming to understand the biomechanics of injury mechanisms and characterising the role of protective devices were allocated to IrRL1 (3 and 9, respectively) and IrR2 (8 and 6, respectively), whereas the two articles setting injury threshold criteria were at the *deployment* level [151,213] (Figure 9b). All but one article on gait retraining were at IrR2 (10), whereas assessment of sport-related risk of injury/predictive factors was found at all three levels of readiness. The role of wearable-based measures in the different studies ranged from being of marginal importance to being crucial (Figure 9c). This last condition was required for studies to be allocated to the *deployment* level.

Looking at injury-related readiness levels from the perspective of specific injuries (Figure 10), we found both *research* and *development* to be similarly represented at the *pre* time setting (72 and 57 articles), and an important share of the deployment level articles (8), with a prevalence of studies on running-related injuries [74,124,130,157,192,229]. Research on running-related injuries (74 articles) had nearly double the number of articles at the development level compared to the research level (44 and 23, respectively). Most were at the pre time setting (63), and only four allowed the detection of dangerous changes at the time of occurrence and before an injury would eventually occur. The literature on anterior cruciate ligament tears (12) was not extensive, and was predominantly at the research level, typically testing different types of jumps and landings to investigate their potential for predicting acute knee injuries; only symmetry of the region of limb stability, at the IrRL3 level, presented a good predictive accuracy [213]. Research on upper-limb injuries (14) focused on baseball- and tennis-related injuries, and included one of the few deployment studies at the post time setting, with the work focusing on quantitative ecological supervision of throwing rehabilitation of baseball players [106]. A manuscript on measuring acute-to-chronic valgus workload in the upper limbs [100] was also at IrRL3; it appeared to be consistent with seven other articles investigating the effect of workload on any type of injury in team sports. This approach represents the most common at scenario, arguably with the highest potential for large-scale deployment.

Sensors 2022, 22, 3225 19 of 33

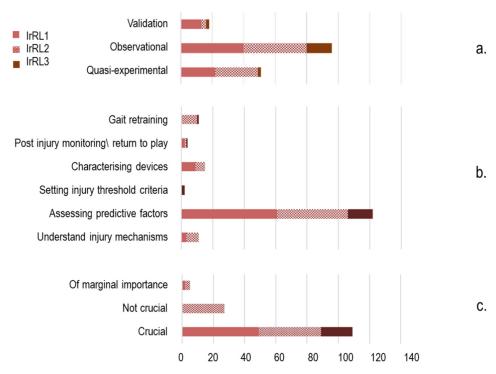


Figure 9. Distribution of studies at different IrRL levels is reported from different perspectives: (a) strength of evidence; (b) scope; (c) relevance of wearable-based parameters.

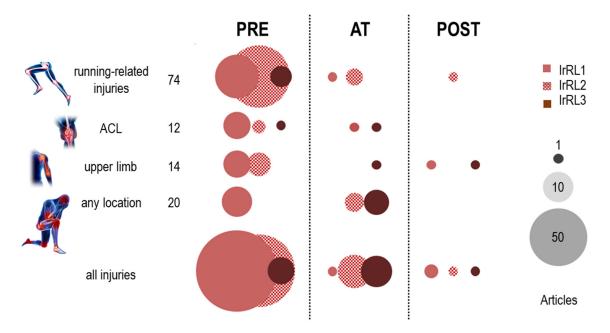


Figure 10. Distribution of studies at different injury-related readiness levels (IrRLs) for different time settings (columns) and injury types (rows).

4. Conclusions

In this systematic scoping review, we described and discussed the state of the art of biomechanical research using wearable technologies to study musculoskeletal injuries in sport. We aimed to characterise key features of the existing knowledge, identify research trends, and analyse common practices in the design, implementation, and dissemination of experiments. Finally, we proposed a taxonomy to gauge the maturity of sensors and methods in relation to being used in applied settings. This classification framework is a

Sensors **2022**, 22, 3225 20 of 33

simple yet novel tool that may help drive the efforts of the scientific community towards improving the applied impact of wearables in injury prevention, monitoring, and recovery.

As a potential limitation, the very recent papers published in this area were not included in the temporal range of this scoping review. This was motivated by the very high publication rate that made their inclusion infeasible. As a matter of fact, we can confirm that this potential limitation did not alter the key points raised in the large number of papers included in this review and presented in the Discussion section. The selected articles undoubtedly testify to the widespread interest in the area and an increasing trend in popularity over the last decade.

The analysis led to some key conclusions, which we report, examine as main reflection points, and use to propose some guidelines and good practices for future research and dissemination.

(1) Articles should explicitly state what the rationale for choosing and analysing specific biomechanical quantities is, and include a justification of what relationship may exist with the injury of interest. When previous literature is cited to support the choice made, the strength of evidence of previous studies should be discussed, together with the context from which that evidence emerged.

Of the 165 works examined, just over half of them explicitly declared their intention to discover new relationships between biomechanical quantities and injuries, or reported well-formulated arguments built on existing knowledge, to justify the collection and analysis of specific biomechanical quantities. Unfortunately, a sizeable part of the literature failed to include this information, or any critical analysis of the sources supporting their rationale. Many studies simply cited previous research as a justification of their work, even if this literature was only hypothesising—not establishing—links to injury. Failing to build on robust evidence may generate a daisy chain of speculative research, which typically ends in identifying findings or approaches that are of potential interest, yet not demonstrating value for injury-related research. This type of investigation should be called upon to provide a stronger rationale through careful scrutiny during the peer-review process. An in-depth critique of existing knowledge and of the strength of the evidence should instead be the starting point for progressing our biomechanical knowledge and its applied impact for the prevention, characterisation, or management of musculoskeletal injuries.

(2) More effort should be spent to fully exploit the potential of wearable technologies to detect and characterise injuries when and where they happen, and to monitor and quantify the effects of interventions (preventive or rehabilitative) more regularly.

Indeed, a small proportion of studies actually aimed to capture musculoskeletal injuries. None attempted to detect or depict injurious events through wearables, with one accidentally capturing an ankle sprain [86], and a single-subject case report describing the process of recovering from a hamstring injury [228]. Most investigations that observed injuries were focused on the quantification of training load, or of acute-chronic workload ratios during training sessions or competition. These metrics, their construction, and their use in different sporting contexts have generated a lively debate in the scientific community [23,236-239] and should therefore be considered very carefully. Regardless of current concerns as to their use and validity, which go beyond the scope of this review, these load measures only report a summary of the whole-body demands experienced by athletes, and arguably do not fully exploit the potential of wearable technologies to monitor movement behaviour and help identify factors or mechanisms associated with specific injuries of a body location or a tissue. Few studies performed pre-season biomechanical assessment, followed by longer-term injury surveillance, in an attempt to identify movements that may increase injury risk. This experimental design could raise questions about the repeatability of biomechanical quantities over time and, hence, their causal link to injury; at the same time, it could facilitate the early detection of a lack of adaptability to ever-changing task and environment constraints (sports injury forecasting), in association with the concepts and tools used to study the behaviour of self-organising systems [240]. Only two articles—both on running—analysed the relationship between mechanical variables and injury in a shorter timeframe, but were still at an exploratory stage. Sensors **2022**, 22, 3225 21 of 33

Finally, there is a large prevalence of observational studies over experimental (no study) and quasi-experimental studies (53 out of 165), which keeps research at a more descriptive level, and does not favour the unveiling of cause–consequence evidence (Figure 4).

(3) More attention should be paid to selecting an appropriate sample size and type, and to describing it thoroughly.

Although it is natural to expect that fewer studies on smaller groups are available for elite populations, the disproportion between the number of male and female participants included in the existing literature clearly emerged, and should be carefully considered when designing future experiments. Moreover, studies should systematically report complete information about their population of interest, including gender—which was missing in some articles on male-prevalent disciplines—and level of participation, for which standardised classifications (e.g., [241]) could be adopted, thus simplifying the comparison and summary of outcomes from different works. The great proportion of studies with less than 30 participants is reflective of research designs that do not attempt to capture actual injuries; rather, they typically compare smaller groups of healthy individuals versus athletes who are either prone to recurrent injury or reporting past injury, but considered to be fully recovered at the time of testing. Following up on Conclusion (2), with a view to increasing the effort to collect real injuries or assess the effectiveness of interventions, researchers should more carefully consider the appropriateness of their sample sizes, as opposed to the frequency of the injuries analysed. Since access to participants, resources (e.g., number of sensors, data collection capacity, funding), or both may be complex for biomechanical studies, the opportunity and effectiveness of multicentre studies should be explored and better promoted.

(4) The quality of the methods, tools, and measures used should be clearly reported, as it is fundamental for the interpretation of the quantities collected. With great power (of the sensors) comes great responsibility (for the researcher) [242].

A non-negligible part of the studies reviewed did not carry out nor report on existing validations of their measuring equipment, protocols, or settings. Two works included information about former validation studies, but without making sure that these tests had been performed on sensors of the same type, making them clearly inappropriate. Discussing aspects such as accuracy, reliability, existing guidelines, and the possible influence of experimental choices on outcome measures (e.g., physical characteristics of the measuring unit; settings such as frequency, resolution, sensitivity, and full-scale capacity; exact attachment location of the sensors; fixing methods, as far as sensors are concerned, but also running surface, fatigue, and measurement protocols) is an essential yet often overlooked element, and should be better taken care of. Indeed, it impacts the interpretation of results, the ability to replicate a study, and the possibility to compare results from different articles. For example, in some cases, we even found it difficult to understand what sensor or element of an integrated system (e.g., in magneto-inertial units with embedded global navigation satellite systems) was used to extract the outcome metrics selected. Finally, results obtained under controlled lab conditions should be handled with care; for example, field-based demands such as fatigue or high-intensity drills may prove difficult to replicate in a laboratory, and it is impossible to investigate acute injuries with lab-based testing. Conversely, guidance and thresholds identified in a lab may be difficult to transfer to field-based situations.

The continuous progress in wearable sensors offers many opportunities to collect data on many athletes simultaneously, non-obtrusively, for long periods, and in field-based situations. However, the great "power" that even consumer-level technologies (e.g., smart phones, watches, pods) currently offer does not come free of problems, such as those associated with the management and processing of large datasets affected by noise. Improvement in data quality and the ability to extract meaningful information from large databases affected by noise are issues that researchers need to carefully consider and address. The advances in data science techniques (e.g., machine learning approaches) could play a great role in this perspective; however, an appropriate and effective use of wearable technologies should be informed by a thorough awareness of sensor limitations, in terms

Sensors **2022**, 22, 3225 22 of 33

of both measurement quality and range of suitable applications. The following list includes some of the most critical issues, but the reader is referred to the recent recommendations in [23,35,43,243] for more complete guidance on countermeasures:

- Noise can be assumed to be proportional to task dynamics, which suggests reducing the mass and dimensions of the devices to the minimum possible;
- b. Appropriate full-scale ranges should be selected according to the measure of interest [244,245];
- c. The estimation of displacement (linear and angular) in magneto-inertial measurement units (MIMUs) is influenced by drift caused by the combination of MEMS physical properties and finite integration [246], which should be spot-checked (e.g., [247,248]) and requires compensation through ad hoc algorithms [247,249];
- d. Errors in orientation estimation can originate from ferromagnetic disturbances when the magnetometer is exploited—particularly indoors [250,251];
- e. Soft-tissue artefacts and fixation techniques affect the validity of measurements, as they can reduce or accentuate the real movement of the body segments that the sensors are attached to [252–254]. Soft-tissue artefacts are particularly problematic and complex to deal with, as they are strongly sensitive to task [235], participant [255], site and method of unit attachment [256,257], and unit removal and replacement [258], calling for recommendations of sensor types and placements specific to sports and parameters of interest (e.g., [259]);
- f. Bespoke calibration techniques may be required to guarantee enough accuracy and reliability throughout the movement of interest and the environmental conditions under which it is performed [260];
- g. Anatomical calibration should be carefully performed to ensure interpretation and comparison within and between athletes, at least through alignment with gravity during a neutral standing posture, or alternatively functional or point-based—especially when assessing joint kinematics [261,262];
- h. Practically, splitting data collection into short trials of less than 30 s, collecting as many trials as possible per condition tested, and performing a pose calibration for each of those conditions typically leads to better measures [79].
- (5) The road towards applied impact offers many opportunities ... but is long and difficult, take "the one less travelled by, [. . .]" and it will make "all the difference" [263]!

The injury-related readiness level classification system we outlined and applied to the selected article database showed that only few investigations are at a stage of maturity where their findings could be deployed for field-based use. This taxonomy allows the identification of applications, sports, and bodily tissues/areas for which more biomechanical research would be beneficial. Indeed, the highest class of readiness relies on the findings from the lower levels of maturity, and mapping the extent of work and knowledge available at the different stages will help to direct research endeavours and appreciate the distance from final knowledge transfer. Sport biomechanics can offer a fundamental contribution to the prevention, assessment, and recovery from musculoskeletal injury and, through the use of wearables, can also play a key role in multiple elements of the many models of injury prevention [3,8,9] and injury causation [10–12] that have been proposed in the literature. For example, it can help identify the factors predisposing an athlete to injury or the events inciting an injury. It can describe and quantify the mechanisms of an injury and the movement behaviours associated with it. It could contribute to the creation of decision-support systems based on quantitative analysis, and help with monitoring interventions and the compliance of athletes and practitioners to those interventions. Our readiness analysis has shown that this last area is particularly lacking.

Performing real-time predictions based on machine learning and providing real-time feedback has a huge potential to both enhance the athlete's performance, through movement recognition [264] and technique correction [23], and to assess injury predictive factors [265] and evaluate them within long-term monitoring of injury-forecasting systems [240]. This is particularly relevant for athletes with disabilities, where personalised

Sensors **2022**, 22, 3225 23 of 33

monitoring systems can be developed to anticipate injuries specific to their disability [26]. It also challenges the research community to develop more intelligent, real-time, accurate information, making it user-friendly and offering coaches and athletes actionable insights based on context-specific evaluation frameworks and on the ability to identify correct forms and common deviations of specific movements according to an agreed-upon clinical consensus [266]. Indeed, personalised and effective wearable technology should be rooted in a thorough understanding of the user's experience, attitudes, and opinions which, if not properly considered, can severely hamper the potential of applications [267].

To enable and maximise the contribution of wearable technology and biomechanics, more coordinated efforts should be spent so that a systematic and sound progression from basic research to knowledge transfer is generated. Discovering biomechanical relationships with injuries and their mechanisms is difficult, and often requires prospective analysis of large cohorts of athletes; this is typically costly, lengthy, and overall difficult to implement for a single research group. Multicentre studies would most likely facilitate this process. That being said, the ever-increasing availability of wearable technologies and smart textiles [268] able to measure a large spectrum of biomechanical and physiological quantities would conceivably boost the research in the abovementioned desirable direction. The integration of multiple sensors of different types, together with a systemic rather than a local approach when studying injury in sports, represents two crucial elements that deserve attention for future research.

Supplementary Materials: The following supporting information can be downloaded at: https://www.mdpi.com/article/10.3390/s22093225/s1, a database with the details of all articles that are not reviews and were included in the systematic review.

Author Contributions: All authors contributed to Conceptualisation, Data Curation, Formal analysis, Investigation, Methodology, Visualisation, Writing—Original Draft, Writing—Review and Editing, and Resources. G.V. and S.F. performed the data retrieval and evaluated the titles and abstracts of the retrieved articles for inclusion. Project Administration was overseen by V.C. and E.P. All authors have read and agreed to the published version of the manuscript.

Funding: This research was funded by an Erasmus+/KA1 grant for international mobility [n. 2018/STT06].

Acknowledgments: The authors wish to thank Verdiana Basso, Vittoria Berettini, Federico Caramia, Alice Ioni, Kevin Marcaccini, Francesco Soliani, Bianca Toniolo, and Matteo Vicini for their support in revising the article.

Conflicts of Interest: Ezio Preatoni, Elena Bergamini, Silvia Fantozzi, Lucie Giraud, Amaranta Orejel Bustos, Giuseppe Vannozzi, and Valentina Camomilla have no conflict of interest. No author has any financial or personal relationships with other people or organisations that could inappropriately influence the manuscript.

References

- 1. Pedersen, B.K.; Saltin, B. Exercise as medicine—Evidence for prescribing exercise as therapy in 26 different chronic diseases. *Scand. J. Med. Sci. Sport.* **2015**, 25, 1–72. [CrossRef] [PubMed]
- 2. McGuine, T.A.; Post, E.G.; Hetzel, S.J.; Brooks, M.A.; Trigsted, S.; Bell, D.R. A Prospective Study on the Effect of Sport Specialization on Lower Extremity Injury Rates in High School Athletes. *Am. J. Sports Med.* **2017**, 45, 2706–2712. [CrossRef] [PubMed]
- 3. Emery, C.A.; Pasanen, K. Current trends in sport injury prevention. *Best Pract. Res. Clin. Rheumatol.* **2019**, 33, 3–15. [CrossRef] [PubMed]
- 4. Sekhon, L.H.S.; Fehlings, M.G. Epidemiology, demographics, and pathophysiology of acute spinal cord injury. *Spine* **2001**, 26, 2–12. [CrossRef]
- 5. Kirkwood, G.; Hughes, T.C.; Pollock, A.M. Results on sports-related injuries in children from NHS emergency care dataset Oxfordshire pilot: An ecological study. *J. R. Soc. Med.* **2019**, *112*, 109–118. [CrossRef]
- 6. EuroSafe Injuries in the European Union. *Report on Injury Statistics* 2008–2010; EuroSafe Injuries in the European Union: Amsterdam, The Netherlands, 2013.
- 7. Creighton, D.W.; Shrier, I.; Shultz, R.; Meeuwisse, W.H.; Matheson, G.O. Return-to-Play in Sport: A Decision-based Model. Clin. J. Sport Med. 2010, 20, 379–385. [CrossRef]

Sensors **2022**, 22, 3225 24 of 33

8. Van Mechelen, W.; Hlobil, H.; Kemper, H.C.G. Incidence, severity, aetiology and prevention of sports injuries. *Sport. Med.* **1992**, 14, 82–99. [CrossRef]

- 9. Finch, C. A new framework for research leading to sports injury prevention. J. Sci. Med. Sport 2006, 9, 3–9. [CrossRef]
- 10. Meeuwisse, W.H.; Tyreman, H.; Hagel, B.; Emery, C. A dynamic model of etiology in sport injury: The recursive nature of risk and causation. *Clin. J. Sport Med.* **2007**, *17*, 215–219. [CrossRef]
- 11. Kumar, S. Theories of musculoskeletal injury causation. Ergonomics 2001, 44, 17–47. [CrossRef]
- 12. Bahr, R.; Krosshaug, T. Understanding injury mechanisms: A key component of preventing injuries in sport. *Br. J. Sports Med.* **2005**, *39*, 324–329. [CrossRef] [PubMed]
- 13. Jacobs, J.M.; Cameron, K.L.; Bojescul, J.A. Lower Extremity Stress Fractures in the Military. *Clin. Sports Med.* **2014**, *33*, 591–613. [CrossRef] [PubMed]
- 14. McIntosh, A.S. Risk compensation, motivation, injuries, and biomechanics in competitive sport. *Br. J. Sports Med.* **2005**, *39*, 2–3. [CrossRef] [PubMed]
- 15. Whiting, W.C.; Zernicke, R.F. Biomechanics of Musculoskeletal Injury; Human Kinetics: Champaign, IL, USA, 2008; ISBN 0736054421.
- 16. Bahr, R.; Alfredson, H.; Järvinen, M.; Järvinen, T.; Khan, K.; Kjær, M.; Matheson, G.; Mæhlum, S. Types and Causes of Injuries. In *The IOC Manual of Sports Injuries*; John Wiley & Sons, Ltd.: Hoboken, NJ, USA, 2012; pp. 1–24. ISBN 9781118467947.
- 17. Panjabi, M.M.; Yoldas, E.; Oxland, T.R.; Crisco, J., III. Subfailure injury of the rabbit anterior cruciate ligament. *J. Orthop. Res.* **1996**, 14, 216–222. [CrossRef] [PubMed]
- 18. Quinn, K.P.; Winkelstein, B.A. Cervical facet capsular ligament yield defines the threshold for injury and persistent joint-mediated neck pain. *J. Biomech.* **2007**, *40*, 2299–2306. [CrossRef]
- 19. Warden, S.J.; Davis, I.S.; Fredericson, M. Management and prevention of bone stress injuries in long-distance runners. *J. Orthop. Sports Phys. Ther.* **2014**, 44, 749–765. [CrossRef]
- 20. Bennett, H.; Arnold, J.; Norton, K.; Davison, K. Are we really "screening" movement? The role of assessing movement quality in exercise settings. *J. Sport Health Sci.* **2020**, *9*, 489–492. [CrossRef]
- 21. Matijevich, E.S.; Branscombe, L.M.; Scott, L.R.; Zelik, K.E. Ground reaction force metrics are not strongly correlated with tibial bone load when running across speeds and slopes: Implications for science, sport and wearable tech. *PLoS ONE* **2019**, 14, e0210000. [CrossRef]
- 22. Adesida, Y.; Papi, E.; McGregor, A.H. Exploring the role of wearable technology in sport kinematics and kinetics: A systematic review. *Sensors* **2019**, *19*, 1597. [CrossRef]
- 23. Camomilla, V.; Bergamini, E.; Fantozzi, S.; Vannozzi, G. Trends supporting the in-field use of wearable inertial sensors for sport performance evaluation: A systematic review. *Sensors* **2018**, *18*, 873. [CrossRef]
- 24. Marinho, D.A.; Neiva, H.P.; Morais, J.E. The use of wearable sensors in human movement analysis in non-swimming aquatic activities: A systematic review. *Int. J. Environ. Res. Public Health* **2019**, *16*, 5067. [CrossRef] [PubMed]
- 25. Mendes, J.J.A.; Vieira, M.E.M.; Pires, M.B.; Stevan, S.L. Sensor fusion and smart sensor in sports and biomedical applications. Sensors 2016, 16, 1569. [CrossRef] [PubMed]
- 26. Rum, L.; Sten, O.; Vendrame, E.; Belluscio, V.; Camomilla, V.; Vannozzi, G.; Truppa, L.; Notarantonio, M.; Sciarra, T.; Lazich, A.; et al. Wearable sensors in sports for persons with disability: A systematic review. *Sensors* **2021**, *21*, 1858. [CrossRef] [PubMed]
- 27. Macadam, P.; Cronin, J.; Neville, J.; Diewald, S. Quantification of the validity and reliability of sprint performance metrics computed using inertial sensors: A systematic review. *Gait Posture* **2019**, 73, 26–38. [CrossRef] [PubMed]
- 28. de Magalhaes, F.A.; Vannozzi, G.; Gatta, G.; Fantozzi, S. Wearable inertial sensors in swimming motion analysis: A systematic review. *J. Sports Sci.* **2015**, *33*, 732–745. [CrossRef]
- 29. Naughton, M.; Jones, B.; Hendricks, S.; King, D.; Murphy, A.; Cummins, C. Correction to: Quantifying the Collision Dose in Rugby League: A Systematic Review, Meta-analysis, and Critical Analysis. *Sport. Med. Open* **2020**, *6*, 50, Correction in *Sports Med. Open* **2020**, *6*, 6. [CrossRef]
- 30. Paquette, M.R.; Napier, C.; Willy, R.W.; Stellingwerff, T. Moving beyond weekly "distance": Optimizing quantification of training load in runners. *J. Orthop. Sports Phys. Ther.* **2020**, *50*, 564–569. [CrossRef]
- 31. Patton, D.A.; Huber, C.M.; Jain, D.; Myers, R.K.; McDonald, C.C.; Margulies, S.S.; Master, C.L.; Arbogast, K.B. Head Impact Sensor Studies in Sports: A Systematic Review Of Exposure Confirmation Methods. *Ann. Biomed. Eng.* **2020**, *48*, 2497–2507. [CrossRef]
- 32. Porciuncula, F.; Roto, A.V.; Kumar, D.; Davis, İ.; Roy, S.; Walsh, C.J.; Awad, L.N. Wearable Movement Sensors for Rehabilitation: A Focused Review of Technological and Clinical Advances. *PMR* **2018**, *10*, S220–S232. [CrossRef]
- 33. Rico-González, M.; Pino-Ortega, J.; Nakamura, F.Y.; Arruda Moura, F.; Rojas-Valverde, D.; Los Arcos, A. Past, present, and future of the technological tracking methods to assess tactical variables in team sports: A systematic review. *Proc. Inst. Mech. Eng. Part P J. Sport. Eng. Technol.* **2020**, 234, 281–290. [CrossRef]
- 34. Chambers, R.; Gabbett, T.J.; Cole, M.H.; Beard, A. The Use of Wearable Microsensors to Quantify Sport-Specific Movements. *Sport Med.* **2015**, 45, 1065–1081. [CrossRef] [PubMed]
- 35. Sheerin, K.R.; Reid, D.; Besier, T.F. The measurement of tibial acceleration in runners—A review of the factors that can affect tibial acceleration during running and evidence-based guidelines for its use. *Gait Posture* **2019**, *67*, 12–24. [CrossRef] [PubMed]
- 36. Van Hooren, B.; Goudsmit, J.; Restrepo, J.; Vos, S. Real-time feedback by wearables in running: Current approaches, challenges and suggestions for improvements. *J. Sports Sci.* **2020**, *38*, 214–230. [CrossRef]

Sensors **2022**, 22, 3225 25 of 33

37. Vanwanseele, B.; Op De Beéck, T.; Schütte, K.; Davis, J. Accelerometer Based Data Can Provide a Better Estimate of Cumulative Load During Running Compared to GPS Based Parameters. *Front. Sport. Act. Living* **2020**, *2*, 154. [CrossRef]

- 38. Wagner, J.F. About Motion Measurement in Sports Based on Gyroscopes and Accelerometers—An Engineering Point of View. *Gyroscopy Navig.* **2018**, *9*, 1–18. [CrossRef]
- 39. Willy, R.W. Innovations and pitfalls in the use of wearable devices in the prevention and rehabilitation of running related injuries. *Phys. Ther. Sport* **2018**, 29, 26–33. [CrossRef] [PubMed]
- 40. De Pasquale, G.; Ruggeri, V. Sensing strategies in wearable bio-mechanical systems for medicine and sport: A review. *J. Micromech. Microeng.* **2019**, 29, 103001. [CrossRef]
- 41. Head, P.L.; Kasser, R.; Appling, S.; Cappaert, T.; Singhal, K.; Zucker-Levin, A. Anterior cruciate ligament reconstruction and dynamic stability at time of release for return to sport. *Phys. Ther. Sport* **2019**, *38*, 80–86. [CrossRef]
- 42. Hood, S.; McBain, T.; Portas, M.; Spears, I. Measurement in sports biomechanics. Meas. Control 2012, 45, 182–186. [CrossRef]
- 43. Hughes, G.; Camomilla, V.; Vanwanseele, B.; Harrison, A.; Fong, D.; Bradshaw, E. Novel technology in sports biomechanics: Some words of caution. *Sport. Biomech.* **2021**, 1–9. [CrossRef]
- 44. Kiely, M.; Warrington, G.; McGoldrick, A.; Cullen, S. Physiological and Performance Monitoring in Competitive Sporting Environments: A Review for Elite Individual Sports. *Strength Cond. J.* **2019**, *41*, 62–74. [CrossRef]
- 45. Li, R.T.; Kling, S.R.; Salata, M.J.; Cupp, S.A.; Sheehan, J.; Voos, J.E. Wearable Performance Devices in Sports Medicine. *Sports Health* **2016**, *8*, 74–78. [CrossRef] [PubMed]
- 46. Lee, J.B.; Ohgi, Y.; James, D.A. Sensor fusion: Let's enhance the performance of performance enhancement. *Procedia Eng.* **2012**, 34, 795–800. [CrossRef]
- 47. Winter, S.C.; Gordon, S.; Brice, S.M.; Lindsay, D.; Barrs, S. A Multifactorial Approach to Overuse Running Injuries: A 1-Year Prospective Study. *Sports Health* **2020**, 12, 296–303. [CrossRef] [PubMed]
- 48. Lutz, J.; Memmert, D.; Raabe, D.; Dornberger, R.; Donath, L. Wearables for integrative performance and tactic analyses: Opportunities, challenges, and future directions. *Int. J. Environ. Res. Public Health* **2020**, *17*, 59. [CrossRef] [PubMed]
- 49. Aroganam, G.; Manivannan, N.; Harrison, D. Review on Wearable Technology Sensors Used in Consumer Sport Applications. *Sensors* **2019**, 19, 1983. [CrossRef]
- 50. Benson, L.C.; Räisänen, A.M.; Clermont, C.A.; Ferber, R. Is This the Real Life, or Is This Just Laboratory? A Scoping Review of IMU-Based Running Gait Analysis. *Sensors* **2022**, 22, 1722. [CrossRef]
- 51. Mooney, R.; Corley, G.; Godfrey, A.; Quinlan, L.R.; ÓLaighin, G. Inertial sensor technology for elite swimming performance analysis: A systematic review. *Sensors* **2015**, *16*, 18. [CrossRef]
- 52. Worsey, M.T.O.; Espinosa, H.G.; Shepherd, J.B.; Thiel, D.V. Inertial sensors for performance analysis in combat sports: A systematic review. *Sports* **2019**, *7*, 28. [CrossRef]
- 53. Weir, G. Anterior cruciate ligament injury prevention in sport: Biomechanically informed approaches. *Sport. Biomech.* **2021**, 1–21. [CrossRef]
- 54. Morgan, A.M.; O'Connor, K.M. Evaluation of an accelerometer to assess knee mechanics during a drop landing. *J. Biomech.* **2019**, 86, 125–131. [CrossRef] [PubMed]
- 55. Pratt, K.A.; Sigward, S.M. Inertial Sensor Angular Velocities Reflect Dynamic Knee Loading during Single Limb Loading in Individuals Following Anterior Cruciate Ligament Reconstruction. *Sensors* **2018**, *18*, 3460. [CrossRef] [PubMed]
- 56. Zago, M.; Sforza, C.; Dolci, C.; Tarabini, M.; Galli, M. Use of machine learning and wearable sensors to predict energetics and kinematics of cutting maneuvers. *Sensors* **2019**, *19*, 3094. [CrossRef] [PubMed]
- 57. Uddin, M.Z.; Seeberg, T.M.; Kocbach, J.; Liverud, A.E.; Gonzalez, V.; Sandbakk, Ø.; Meyer, F. Estimation of mechanical power output employing deep learning on inertial measurement data in roller ski skating. *Sensors* **2021**, *21*, 6500. [CrossRef]
- 58. Andrada, F. Could an algorithm predict an injury? *Nature* **2021**, *592*, 10–11.
- 59. Ceyssens, L.; Vanelderen, R.; Barton, C.; Malliaras, P.; Dingenen, B. Biomechanical Risk Factors Associated with Running-Related Injuries: A Systematic Review. *Sport Med.* **2019**, *49*, 1095–1115. [CrossRef]
- 60. Zadpoor, A.A.; Nikooyan, A.A. The relationship between lower-extremity stress fractures and the ground reaction force: A systematic review. *Clin. Biomech.* **2011**, *26*, 23–28. [CrossRef]
- 61. Peters, M.D.J.; Godfrey, C.M.; Khalil, H.; McInerney, P.; Parker, D.; Soares, C.B. Guidance for conducting systematic scoping reviews. *Int. J. Evid. Based Healthc.* **2015**, *13*, 141–146. [CrossRef]
- 62. Kim, T.; Chiu, W. Consumer acceptance of sports wearable technology: The role of technology readiness. *Int. J. Sport. Mark. Spons.* **2019**, *20*, 109–126. [CrossRef]
- 63. Sauser, B.; Verma, D.; Ramirez-Marquez, J.; Gove, R. From TRL to SRL: The concept of systems readiness levels. *Conf. Syst. Eng. Res.* 2006, 1–10.
- 64. Tricco, A.C.; Lillie, E.; Zarin, W.; O'Brien, K.K.; Colquhoun, H.; Levac, D.; Moher, D.; Peters, M.D.J.; Horsley, T.; Weeks, L.; et al. PRISMA extension for scoping reviews (PRISMA-ScR): Checklist and explanation. *Ann. Intern. Med.* **2018**, 169, 467–473. [CrossRef] [PubMed]
- 65. Covidence. Covidence World-Class Systematic Review Management. Available online: https://www.covidence.org/home (accessed on 21 January 2022).
- 66. Higgins, J.P.T.; Green, S. Cochrane Handbook for Systematic Reviews of Interventions; Sally, E., Cochrane Collaboration, Eds.; Wiley InterScience (Online Service); Wiley-Blackwell: Hoboken, NJ, USA, 2008; ISBN 1119964792.

Sensors **2022**, 22, 3225 26 of 33

67. Portney, L.G.; Watkins, M.P. Foundations of Clinical Research: Applications to Practice, 3rd ed.; Pearson, Ed.; Pearson/Prentice Hall: Upper Saddle River, NJ, USA, 2015; ISBN 978-0803646575.

- 68. Burns, P.; Rohrich, R.; Chung, K. EU Alpine Space Programme, Project AlpBC (Capitalising knowledge on Alpine Building Culture by performing regional smart planning and consultancy strategies for sustainable development), 2012–2015. *Plast. Reconstr. Surg.* **2015**, *128*, 305–310. [CrossRef] [PubMed]
- 69. McKinney, J.; Velghe, J.; Fee, J.; Isserow, S.; Drezner, J.A. Defining Athletes and Exercisers. *Am. J. Cardiol.* **2019**, 123, 532–535. [CrossRef] [PubMed]
- 70. Henderson, R.M.; Clark, K.B. Architectural Innovation: The Reconfiguration of Existing Product Technologies and the Failure of Established Firms. *Source Adm. Sci. Q.* **1990**, *35*, 9–30. [CrossRef]
- 71. Ghali, B.M.; Owoeye, O.B.A.; Stilling, C.; Palacios-Derflingher, L.; Jordan, M.; Pasanen, K.; Emery, C.A. Internal and external workload in youth basketball players who are symptomatic and asymptomatic for patellar tendinopathy. *J. Orthop. Sports Phys. Ther.* **2020**, *50*, 402–408. [CrossRef]
- 72. Fu, W.; Fang, Y.; Liu, D.M.S.; Wang, L.; Ren, S.; Liu, Y. Surface effects on in-shoe plantar pressure and tibial impact during running. *J. Sport Health Sci.* **2015**, *4*, 384–390. [CrossRef]
- 73. Santospagnuolo, A.; Boaretto, D.; Lalli, D.; Santoboni, F.; Nusca, S.; Callà, B.; Barchiesi, F.; Molinaro, L.; Rossi, S.; Vulpiani, M.C.; et al. New predictive factors for anterior cruciate ligament injury in young female basketball players: A case report. *Med. Dello Sport* **2019**, 72, 654–662. [CrossRef]
- 74. Schütte, K.H.; Seerden, S.; Venter, R.; Vanwanseele, B. Influence of outdoor running fatigue and medial tibial stress syndrome on accelerometer-based loading and stability. *Gait Posture* **2018**, *59*, 222–228. [CrossRef]
- 75. Sampson, J.A.; Murray, A.; Williams, S.; Sullivan, A.; Fullagar, H.H.K. Subjective wellness, acute: Chronic workloads, and injury risk in college football. *J. Strength Cond. Res.* **2019**, *33*, 3367–3373. [CrossRef]
- 76. Senington, B.; Lee, R.Y.; Williams, J.M. Biomechanical risk factors of lower back pain in cricket fast bowlers using inertial measurement units: A prospective and retrospective investigation. *BMJ Open Sport Exerc. Med.* **2020**, *6*, e000818. [CrossRef]
- 77. Sasaki, S.; Nagano, Y.; Ichikawa, H. Loading differences in single-leg landing in the forehand- and backhand-side courts after an overhead stroke in badminton: A novel tri-axial accelerometer research. *J. Sports Sci.* **2018**, *36*, 2794–2801. [CrossRef] [PubMed]
- 78. Peng, P.; Ding, S.; Wang, Z.; Zhang, Y.; Pan, J. Acute effect of engineered thermoplastic polyurethane elastomer knockoff running footwear on foot loading and comfort during heel-to-toe running. *Gait Posture* **2020**, *79*, 111–116. [CrossRef] [PubMed]
- 79. Pimentel, R.; Potter, M.N.; Carollo, J.J.; Howell, D.R.; Sweeney, E.A. Peak sagittal plane spine kinematics in female gymnasts with and without a history of low back pain. *Clin. Biomech.* **2020**, *76*, 105019. [CrossRef] [PubMed]
- 80. Pinheiro, L.S.P.; de Ocarino, J.M.; Bittencourt, N.F.N.; Souza, T.R.; de Souza Martins, S.C.; Bomtempo, R.A.B.; Resende, R.A. Lower limb kinematics and hip extensors strengths are associated with performance of runners at high risk of injury during the modified Star Excursion Balance Test. *Braz. J. Phys. Ther.* **2020**, *24*, 488–495. [CrossRef] [PubMed]
- 81. Preatoni, E.; Cazzola, D.; Stokes, K.A.; England, M.; Trewartha, G. Pre-binding prior to full engagement improves loading conditions for front-row players in contested Rugby Union scrums. *Scand. J. Med. Sci. Sport.* **2016**, *26*, 1398–1407. [CrossRef] [PubMed]
- 82. Purevsuren, T.; Khuyagbaatar, B.; Kim, K.; Kim, Y.H. Investigation of Knee Joint Forces and Moments during Short-Track Speed Skating Using Wearable Motion Analysis System. *Int. J. Precis. Eng. Manuf.* **2018**, *19*, 1055–1060. [CrossRef]
- 83. Fu, W.; Fang, Y.; Gu, Y.; Huang, L.; Li, L.; Liu, Y. Shoe cushioning reduces impact and muscle activation during landings from unexpected, but not self-initiated, drops. *J. Sci. Med. Sport* **2017**, 20, 915–920. [CrossRef]
- 84. Rawashdeh, S.A.; Rafeldt, D.A.; Uhl, T.L. Wearable IMU for shoulder injury prevention in overhead sports. *Sensors* **2016**, *16*, 1847. [CrossRef]
- 85. Reenalda, J.; Maartens, E.; Buurke, J.H.; Gruber, A.H. Kinematics and shock attenuation during a prolonged run on the athletic track as measured with inertial magnetic measurement units. *Gait Posture* **2019**, *68*, 155–160. [CrossRef]
- 86. Remus, A.; Caulfield, B.; Doherty, C.; Crowe, C.; Severini, G.; Delahunt, E. A laboratory captured "giving way" episode in an individual with chronic ankle instability. *J. Biomech.* **2018**, *76*, 241–246. [CrossRef]
- 87. Milner, C.E.; Hawkins, J.L.; Aubol, K.G. Tibial acceleration during running is higher in field testing than indoor testing. *Med. Sci. Sports Exerc.* **2020**, *52*, 1361–1366. [CrossRef] [PubMed]
- 88. Mizrahi, J. Fatique Effect on Running Kinematics. Hum. Mov. Sci. 2000, 19, 139–151. [CrossRef]
- 89. Milner, C.E.; Ferber, R.; Pollard, C.D.; Hamill, J.; Davis, I.S. Biomechanical factors associated with tibial stress fracture in female runners. *Med. Sci. Sports Exerc.* **2006**, *38*, 323–328. [CrossRef] [PubMed]
- 90. Mizrahi, J.; Verbitsky, O.; Isakov, E. Fatigue-related loading imbalance on the shank in running: A possible factor in stress fractures. *Ann. Biomed. Eng.* **2000**, *28*, 463–469. [CrossRef]
- 91. Moran, K.A.; Marshall, B.M. Effect of fatigue on tibial impact accelerations and knee kinematics in drop jumps. *Med. Sci. Sports Exerc.* **2006**, *38*, 1836–1842. [CrossRef]
- 92. Moore, I.S.; Jones, A.; Dixon, S. The pursuit of improved running performance: Can changes in cushioning and somatosensory feedback influence running economy and injury risk? *Footwear Sci.* **2014**, *6*, 1–11. [CrossRef]
- 93. Ogon, M.; Aleksiev, A.R.; Spratt, K.F.; Pope, M.H.; Saltzman, C.L. Footwear affects the behavior of low back muscles when jogging. *Int. J. Sports Med.* **2001**, 22, 414–419. [CrossRef]

Sensors **2022**, 22, 3225 27 of 33

94. Dowling, B.; McNally, M.P.; Laughlin, W.A.; Onate, J.A. Changes in Throwing Arm Mechanics at Increased Throwing Distances During Structured Long-Toss. *Am. J. Sports Med.* **2018**, *46*, 3002–3006. [CrossRef]

- 95. Olin, E.D.; Gutierrez, G.M. EMG and tibial shock upon the first attempt at barefoot running. *Hum. Mov. Sci.* **2013**, *32*, 343–352. [CrossRef]
- 96. Mahar, A.T.; Derrick, T.R.; Hamill, J.; Caldwell, G.E. Impact shock and attenuation during in-line skating. *Med. Sci. Sports Exerc.* 1997, 29, 1069–1075. [CrossRef]
- 97. Martínez-Gramage, J.; Albiach, J.P.; Moltó, I.N.; Amer-Cuenca, J.J.; Moreno, V.H.; Segura-Ortí, E. A random forest machine learning framework to reduce running injuries in young triathletes. *Sensors* **2020**, *20*, 6388. [CrossRef] [PubMed]
- 98. McLellan, C.P.; Lovell, D.I. Neuromuscular responses to impact and collision during elite rugby league match play. *J. Strength Cond. Res.* **2012**, *26*, 1431–1440. [CrossRef] [PubMed]
- 99. Meardon, S.A.; Hamill, J.; Derrick, T.R. Running injury and stride time variability over a prolonged run. *Gait Posture* **2011**, 33, 36–40. [CrossRef] [PubMed]
- 100. Mehta, S. Relationship between workload and throwing injury in varsity baseball players. *Phys. Ther. Sport* **2019**, 40, 66–70. [CrossRef]
- 101. Mcnair, P.J.; Marshall, R.N. Kinematic and kinetic parameters associated with running in different shoes. *Br. J. Sports Med.* **1994**, 28, 256–261. [CrossRef]
- 102. Meyer, C.; Mohr, M.; Falbriard, M.; Nigg, S.R.; Nigg, B.M. Influence of footwear comfort on the variability of running kinematics. *Footwear Sci.* **2018**, *10*, 29–38. [CrossRef]
- 103. Milner, C.E.; Hamill, J.; Davis, I. Are knee mechanics during early stance related to tibial stress fracture in runners? *Clin. Biomech.* **2007**, 22, 697–703. [CrossRef]
- 104. Li, R.T.; Salata, M.J.; Rambhia, S.; Sheehan, J.; Voos, J.E. Does Overexertion Correlate with Increased Injury? The Relationship between Player Workload and Soft Tissue Injury in Professional American Football Players Using Wearable Technology. *Sports Health* 2020, 12, 66–73. [CrossRef]
- 105. Gabbett, T.; Jenkins, D.; Abernethy, B. Physical collisions and injury during professional rugby league skills training. *J. Sci. Med. Sport* **2010**, *13*, 578–583. [CrossRef]
- 106. Lizzio, V.A.; Smith, D.G.; Jildeh, T.R.; Gulledge, C.M.; Swantek, A.J.; Stephens, J.P.; Schulz, B.M.; Makhni, E.C. Importance of radar gun inclusion during return-to-throwing rehabilitation following ulnar collateral ligament reconstruction in baseball pitchers: A simulation study. *J. Shoulder Elb. Surg.* 2020, 29, 587–592. [CrossRef]
- 107. Lizzio, V.A.; Gulledge, C.M.; Smith, D.G.; Meldau, J.E.; Borowsky, P.A.; Moutzouros, V.; Makhni, E.C. Predictors of elbow torque among professional baseball pitchers. *J. Shoulder Elb. Surg.* **2020**, *29*, 316–320. [CrossRef] [PubMed]
- 108. Lo Martire, R.; Gladh, K.; Westman, A.; Lindholm, P.; Nilsson, J.; Äng, B.O. Neck muscle activity in skydivers during parachute opening shock. *Scand. J. Med. Sci. Sport.* **2016**, *26*, 307–316. [CrossRef] [PubMed]
- 109. Lucas-Cuevas, A.G.; Encarnación-Martínez, A.; Camacho-García, A.; Llana-Belloch, S.; Pérez-Soriano, P. The location of the tibial accelerometer does influence impact acceleration parameters during running. *J. Sports Sci.* **2017**, *35*, 1734–1738. [CrossRef] [PubMed]
- 110. Lucas-Cuevas, A.G.; Camacho-García, A.; Llinares, R.; Quesada, J.I.P.; Llana-Belloch, S.; Pérez-Soriano, P. Influence of custom-made and prefabricated insoles before and after an intense run. *PLoS ONE* **2017**, *12*, e0173179. [CrossRef] [PubMed]
- 111. Macdermid, P.W.; Fink, P.W.; Stannard, S.R. The Effects of Vibrations Experienced during Road vsOff-road Cycling. *Int. J. Sports Med.* **2015**, *36*, 783–788. [CrossRef] [PubMed]
- 112. Macdermid, P.W.; Miller, M.C.; Macdermid, F.M.; Fink, P.W. Tyre volume and pressure effects on impact attenuation during mountain bike riding. *Shock Vib.* **2015**, 2015, 191075. [CrossRef]
- 113. Jørgensen, U. Body load in heel-strike running: The effect of a firm heel counter. Am. J. Sports Med. 1990, 18, 177–181. [CrossRef]
- 114. Kim, K.J.A.E.; Gailey, R.; Agrawal, V.; Gaunaurd, I.; Feigenbaum, L.; Bennett, C.; Felt, V.; Best, T.M. Quantification of agility testing with inertial sensors after a knee injury. *Med. Sci. Sports Exerc.* **2020**, 52, 244–251. [CrossRef]
- 115. Klous, M.; Müller, E.; Schwameder, H. Three-dimensional lower extremity joint loading in a carved Ski and snowboard turn: A pilot study. *Comput. Math. Methods Med.* **2014**, 2014, 340272. [CrossRef]
- 116. Dufek, J.S.; Mercer, J.A.; Teramoto, K.; Mangus, B.C.; Freedman, J.A. Impact attenuation and variability during running in females: A lifespan investigation. *J. Sport Rehabil.* **2008**, *17*, 230–242. [CrossRef]
- 117. Kiernan, D.; Hawkins, D.A.; Manoukian, M.A.C.; McKallip, M.; Oelsner, L.; Caskey, C.F.; Coolbaugh, C.L. Accelerometer-based prediction of running injury in National Collegiate Athletic Association track athletes. *J. Biomech.* **2018**, *73*, 201–209. [CrossRef] [PubMed]
- 118. Lahti, J.; Mendiguchia, J.; Ahtiainen, J.; Anula, L.; Kononen, T.; Kujala, M.; Matinlauri, A.; Peltonen, V.; Thibault, M.; Toivonen, R.M.; et al. Multifactorial individualised programme for hamstring muscle injury risk reduction in professional football: Protocol for a prospective cohort study. *BMJ Open Sport Exerc. Med.* **2020**, *6*, e000758. [CrossRef]
- 119. Knudson, D.; Blackwell, J. Upper Extremity Angular Kinematics of the One-Handed Backhand Drive in Tennis Players with and without Tennis Elbow. *Int. J. Sports Med.* 1997, 18, 79–82. [CrossRef] [PubMed]
- 120. Hong, Y.; Wang, S.J.; Lam, W.K.; Cheung, J.T.-M. Kinetics of badminton lunges in four directions. *J. Appl. Biomech.* **2014**, 30, 113–118. [CrossRef] [PubMed]

Sensors **2022**, 22, 3225 28 of 33

121. Lapinski, M.; Medeiros, C.B.; Scarborough, D.M.; Berkson, E.; Gill, T.J.; Kepple, T.; Paradiso, J.A. A wide-range, wireless wearable inertial motion sensing system for capturing fast athletic biomechanics in overhead pitching. *Sensors* **2019**, *19*, 3637. [CrossRef]

- 122. Hong, H.; Han, L.; Liao, Y.; Hu, C.; Chang, L. Nonlinear Dynamic Model of Basic Tennis Actions. *J. Vib. Eng. Technol.* **2019**, 7,497–505. [CrossRef]
- 123. Jarning, J.M.; Mok, K.M.; Hansen, B.H.; Bahr, R. Application of a tri-axial accelerometer to estimate jump frequency in volleyball. *Sport. Biomech.* **2015**, *14*, 95–105. [CrossRef]
- 124. Johnson, C.D.; Outerleys, J.; Jamison, S.T.; Tenforde, A.S.; Ruder, M.; Davis, I.S. Comparison of Tibial Shock during Treadmill and Real-World Running. *Med. Sci. Sports Exerc.* **2020**, *52*, 1557–1562. [CrossRef]
- 125. Hughes, T.; Jones, R.K.; Starbuck, C.; Sergeant, J.C.; Callaghan, M.J. The value of tibial mounted inertial measurement units to quantify running kinetics in elite football (soccer) players. A reliability and agreement study using a research orientated and a clinically orientated system. *J. Electromyogr. Kinesiol.* **2019**, *44*, 156–164. [CrossRef]
- 126. Jaspers, A.; Kuyvenhoven, J.P.; Staes, F.; Frencken, W.G.P.; Helsen, W.F.; Brink, M.S. Examination of the external and internal load indicators' association with overuse injuries in professional soccer players. *J. Sci. Med. Sport* **2018**, *21*, 579–585. [CrossRef]
- 127. Edwards, W.B.; Derrick, T.R.; Hamill, J. Musculoskeletal attenuation of impact shock in response to knee angle manipulation. *J. Appl. Biomech.* **2012**, *28*, 502–510. [CrossRef] [PubMed]
- 128. Lam, W.K.; Liebenberg, J.; Woo, J.; Park, S.K.; Yoon, S.H.; Cheung, R.T.H.; Ryu, J. Do running speed and shoe cushioning influence impact loading and tibial shock in basketball players? *PeerJ* **2018**, 2018, e4753. [CrossRef] [PubMed]
- 129. Jones, A.; Page, R.; Brogden, C.; Langley, B.; Greig, M. The influence of playing surface on the loading response to soccer-specific activity. *J. Sport Rehabil.* **2020**, 29, 1166–1170. [CrossRef] [PubMed]
- 130. Gilgen-Ammann, R.; Taube, W.; Wyss, T. Gait asymmetry during 400-to 1000-m high-intensity track running in relation to injury history. *Int. J. Sports Physiol. Perform.* **2017**, *12*, 157–160. [CrossRef] [PubMed]
- 131. Gladh, K.; Lo Martire, R.; Äng, B.O.; Lindholm, P.; Nilsson, J.; Westman, A. Decelerations of parachute opening shock in skydivers. *Aerosp. Med. Hum. Perform.* **2017**, *88*, 121–127. [CrossRef] [PubMed]
- 132. Jones, A.; Brogden, C.; Page, R.; Langley, B.; Greig, M. The Influence of Soccer Playing Surface on the Loading Response to Ankle (P) Rehabilitation Exercises. *J. Sport Rehabil.* **2020**, *30*, 105–111. [CrossRef]
- 133. Glassbrook, D.J.; Fuller, J.T.; Alderson, J.A.; Doyle, T.L.A. Measurement of lower-limb asymmetry in professional rugby league: A technical note describing the use of inertial measurement units. *PeerJ* 2020, 2020, e9366. [CrossRef]
- 134. Greenhalgh, A.; Sinclair, J.; Leat, A.; Chockalingam, N. Influence of footwear choice, velocity and surfaces on tibial accelerations experienced by field hockey participants during running. *Footwear Sci.* **2012**, *4*, 213–219. [CrossRef]
- 135. Greenhalgh, A.; Bottoms, L.; Sinclair, J. Influence of surface on impact shock experienced during a fencing lunge. *J. Appl. Biomech.* **2013**, *29*, 463–467. [CrossRef]
- 136. Greenwald, R.M.; Simpson, F.H.; Michel, F.I. Wrist biomechanics during snowboard falls. *Proc. Inst. Mech. Eng. Part P J. Sport. Eng. Technol.* **2013**, 227, 244–254. [CrossRef]
- 137. Gross, T.S.; Nelson, R.C. The shock attenuation role of the ankle during landing from a vertical jump. *Med. Sci. Sport. Exerc.* **1988**, 20, 506–514. [CrossRef]
- 138. Elvin, N.G.; Elvin, A.A.; Arnoczky, S.P. Correlation between ground reaction force and tibial acceleration in vertical jumping. *J. Appl. Biomech.* **2007**, 23, 180–189. [CrossRef] [PubMed]
- 139. Hennig, E.M.; Rosenbaum, D.; Milani, T.L. Transfer of tennis racket vibrations onto the human forearm. *Med. Sci. Sports Exerc.* **1992**, 24, 1134–1140. [CrossRef] [PubMed]
- 140. Gastin, P.B.; McLean, O.; Spittle, M.; Breed, R.V.P. Quantification of tackling demands in professional Australian football using integrated wearable athlete tracking technology. *J. Sci. Med. Sport* **2013**, *16*, 589–593. [CrossRef] [PubMed]
- 141. García-Pérez, J.A.; Pérez-Soriano, P.; Belloch, S.L.; Lucas-Cuevas, Á.G.; Sánchez-Zuriaga, D. Effects of treadmill running and fatigue on impact acceleration in distance running. *Sport. Biomech.* **2014**, *13*, 259–266. [CrossRef]
- 142. Gastin, P.B.; Mclean, O.C.; Breed, R.V.P.; Spittle, M. Tackle and impact detection in elite Australian football using wearable microsensor technology. *J. Sports Sci.* **2014**, *32*, 947–953. [CrossRef]
- 143. Gaunaurd, I.; Kim, K.J.; Feigenbaum, L.; Raya, M.; Barraga, M.; Fontela, N.; Gailey, R. Construct validation of lower limb segmental excursion as a measure of potential risk for lower limb injury in Division I women's basketball players. *J. Biomech.* **2019**, *84*, 252–256. [CrossRef]
- 144. Eggers, T.M.; Massard, T.I.; Clothier, P.J.; Lovell, R. Measuring vertical stiffness in sport with accelerometers: Exercise caution! *J. Strength Cond. Res.* **2018**, 32, 1919–1922. [CrossRef]
- 145. Elvin, N.G.; Elvin, A.A.; Arnoczky, S.P.; Torry, M.R. The correlation of segment accelerations and impact forces with knee angle in jump landing. *J. Appl. Biomech.* **2007**, 23, 203–212. [CrossRef]
- 146. Encarnación-Martínez, A.; Sanchis-Sanchis, R.; Pérez-Soriano, P.; García-Gallart, A. Relationship between muscular extensibility, strength and stability and the transmission of impacts during fatigued running. *Sport. Biomech.* **2020**, 1–17. [CrossRef]
- 147. Giandolini, M.; Pavailler, S.; Samozino, P.; Morin, J.B.; Horvais, N. Foot strike pattern and impact continuous measurements during a trail running race: Proof of concept in a world-class athlete. *Footwear Sci.* **2015**, *7*, 127–137. [CrossRef]
- 148. Encarnación-Martínez, A.; Pérez-Soriano, P.; Llana-Belloch, S. Differences in ground reaction forces and shock impacts between nordic walking and walking. *Res. Q. Exerc. Sport* **2015**, *86*, 94–99. [CrossRef] [PubMed]

Sensors **2022**, 22, 3225 29 of 33

149. Cummins, C.; Orr, R. Analysis of physical collisions in elite National Rugby League match play. *Int. J. Sports Physiol. Perform.* **2015**, *10*, 732–739. [CrossRef] [PubMed]

- 150. De Hoyo, M.; Cohen, D.D.; Sañudo, B.; Carrasco, L.; Álvarez-Mesa, A.; del Ojo, J.J.; Domínguez-Cobo, S.; Mañas, V.; Otero-Esquina, C. Influence of football match time–motion parameters on recovery time course of muscle damage and jump ability. *J. Sports Sci.* 2016, 34, 1363–1370. [CrossRef]
- 151. De Leeuw, A.W.; van der Zwaard, S.; van Baar, R.; Knobbe, A. Personalized machine learning approach to injury monitoring in elite volleyball players. *Eur. J. Sport Sci.* **2021**, 1–10. [CrossRef]
- 152. Derrick, T.R.; Hamill, J.; Caldwell, G.E. Energy absorption of impacts during running at various stride lengths. *Med. Sci. Sports Exerc.* **1998**, *30*, 128–135. [CrossRef]
- 153. Derrick, T.R.; Dereu, D.; Mclean, S.P. Impacts and kinematic adjustments during an exhaustive run. *Med. Sci. Sports Exerc.* **2002**, 34, 998–1002. [CrossRef]
- 154. Dowling, A.V.; Favre, J.; Andriacchi, T.P. A wearable system to assess risk for anterior cruciate ligament injury during jump landing: Measurements of temporal events, jump height, and sagittal plane kinematics. *J. Biomech. Eng.* **2011**, *133*, 071008. [CrossRef]
- 155. Dowling, A.V.; Favre, J.; Andriacchi, T.P. Inertial sensor-based feedback can reduce key risk metrics for anterior cruciate ligament injury during jump landings. *Am. J. Sports Med.* **2012**, *40*, 1075–1083. [CrossRef]
- 156. Dowling, A.V.; Favre, J.; Andriacchi, T.P. Characterization of thigh and shank segment angular velocity during jump landing tasks commonly used to evaluate risk for ACL injury. *J. Biomech. Eng.* **2012**, *134*, 091006. [CrossRef]
- 157. Colapietro, M.; Fraser, J.J.; Resch, J.E.; Hertel, J. Running mechanics during 1600 meter track runs in young adults with and without chronic ankle instability. *Phys. Ther. Sport* **2020**, *42*, 16–25. [CrossRef] [PubMed]
- 158. Giandolini, M.; Horvais, N.; Farges, Y.; Samozino, P.; Morin, J.B. Impact reduction through long-term intervention in recreational runners: Midfoot strike pattern versus low-drop/low-heel height footwear. *Eur. J. Appl. Physiol.* **2013**, 113, 2077–2090. [CrossRef] [PubMed]
- 159. Cong, Y.; Lam, W.K.; Cheung, J.T.M.; Zhang, M. In-shoe plantar tri-axial stress profiles during maximum-effort cutting maneuvers. *J. Biomech.* **2014**, *47*, 3799–3806. [CrossRef] [PubMed]
- 160. Colby, M.J.; Dawson, B.; Heasman, J.; Rogalski, B.; Gabbett, T.J. Accelerometer and GPS-derived running loads and injury risk in elite Australian footballers. *J. Strength Cond. Res.* **2014**, *28*, 2244–2252. [CrossRef]
- 161. Creaby, M.W.; Franettovich Smith, M.M. Retraining running gait to reduce tibial loads with clinician or accelerometry guided feedback. *J. Sci. Med. Sport* **2016**, *19*, 288–292. [CrossRef]
- 162. Coventry, E.; O'Connor, K.M.; Hart, B.A.; Earl, J.E.; Ebersole, K.T. The effect of lower extremity fatigue on shock attenuation during single-leg landing. *Clin. Biomech.* **2006**, *21*, 1090–1097. [CrossRef]
- 163. Crowell, H.P.; Milnert, C.E.; Hamill, J.; Davis, I.S. Reducing impact loading during running with the use of real-time visual feedback. *J. Orthop. Sports Phys. Ther.* **2010**, *40*, 206–213. [CrossRef]
- 164. Chen, Y.; Li, J.X.; Hong, Y.; Wang, L. Plantar stress-related injuries in male basketball players: Variations on plantar loads during different maximum-effort maneuvers. *Biomed. Res. Int.* **2018**, 2018, 4523849. [CrossRef]
- 165. Cheung, R.T.H.; Zhang, J.H.; Chan, Z.Y.S.; An, W.W.; Au, I.P.H.; MacPhail, A.; Davis, I.S. Shoe-mounted accelerometers should be used with caution in gait retraining. *Scand. J. Med. Sci. Sport.* **2019**, *29*, 835–842. [CrossRef]
- 166. Cheung, R.T.H.; An, W.W.; Au, I.P.H.; Zhang, J.H.; Chan, Z.Y.S.; MacPhail, A.J. Control of impact loading during distracted running before and after gait retraining in runners. *J. Sports Sci.* **2018**, *36*, 1497–1501. [CrossRef]
- 167. Chan, Y.Y.; Fong, D.T.P.; Chung, M.M.L.; Li, W.J.; Liao, W.H.; Yung, P.S.H.; Chan, K.M. Identification of ankle sprain motion from common sporting activities by dorsal foot kinematics data. *J. Biomech.* **2010**, *43*, 1965–1969. [CrossRef] [PubMed]
- 168. Cummins, C.; Orr, R. Collision characteristics of shoulder charge tackles in elite rugby league. *Int. J. Perform. Anal. Sport* **2015**, 15, 1090–1101. [CrossRef]
- 169. Giandolini, M.; Horvais, N.; Rossi, J.; Millet, G.Y.; Samozino, P.; Morin, J.B. Foot strike pattern differently affects the axial and transverse components of shock acceleration and attenuation in downhill trail running. *J. Biomech.* **2016**, *49*, 1765–1771. [CrossRef] [PubMed]
- 170. Clansey, A.C.; Hanlon, M.; Wallace, E.S.; Lake, M.J. Effects of fatigue on running mechanics associated with tibial stress fracture risk. *Med. Sci. Sports Exerc.* **2012**, *44*, 1917–1923. [CrossRef] [PubMed]
- 171. Clarke, T.E.; Cooper, L.B.; Hamill, C.L.; Clark, D.E. The effect of varied stride rate upon shank deceleration in running. *J. Sports Sci.* 1985, 3, 41–49. [CrossRef] [PubMed]
- 172. Clermont, C.A.; Benson, L.C.; Edwards, W.B.; Hettinga, B.A.; Ferber, R. New considerations for wearable technology data: Changes in running biomechanics during a marathon. *J. Appl. Biomech.* **2019**, *35*, 401–409. [CrossRef] [PubMed]
- 173. Clermont, C.A.; Pohl, A.J.; Ferber, R. Fatigue-related changes in running gait patterns persist in the days following a marathon race. *J. Sport Rehabil.* **2020**, *29*, 934–941. [CrossRef] [PubMed]
- 174. Brizuela, G.; Llana, S.; Ferrandis, R.; García-Belenguer, A.C. The influence of basketball shoes with increased ankle support on shock attenuation and performance in running and jumping. *J. Sports Sci.* **1997**, *15*, 505–515. [CrossRef]
- 175. Brown, W.; Greig, M. Tri-axial accelerometry as an injury predictor tool in elite soccer. *Int. J. Athl. Ther. Train.* **2017**, 22, 44–48. [CrossRef]
- 176. Brownridge, A.; Twigg, P.; Sigurnjak, S. Measurement of human motion in performance. Meas. Control 2013, 46, 21–25. [CrossRef]

Sensors **2022**, 22, 3225 30 of 33

177. Butler, R.J.; Hamill, J.; Davis, I. Effect of footwear on high and low arched runners' mechanics during a prolonged run. *Gait Posture* **2007**, 26, 219–225. [CrossRef] [PubMed]

- 178. Camp, C.L.; Tubbs, T.G.; Fleisig, G.S.; Dines, J.S.; Dines, D.M.; Altchek, D.W.; Dowling, B. The Relationship of Throwing Arm Mechanics and Elbow Varus Torque: Within-Subject Variation for Professional Baseball Pitchers across 82,000 Throws. *Am. J. Sports Med.* 2017, 45, 3030–3035. [CrossRef] [PubMed]
- 179. Cazzola, D.; Preatoni, E.; Stokes, K.A.; England, M.E.; Trewartha, G. A modified prebind engagement process reduces biomechanical loading on front row players during scrummaging: A cross-sectional study of 11 elite teams. *Br. J. Sports Med.* **2015**, 49, 541–546. [CrossRef] [PubMed]
- 180. Enders, H.; von Tscharner, V.; Nigg, B.M. The effects of preferred and non-preferred running strike patterns on tissue vibration properties. *J. Sci. Med. Sport* **2014**, 17, 218–222. [CrossRef] [PubMed]
- 181. Chadefaux, D.; Gueguen, N.; Thouze, A.; Rao, G. 3D propagation of the shock-induced vibrations through the whole lower-limb during running. *J. Biomech.* **2019**, *96*, 109343. [CrossRef] [PubMed]
- 182. Agresta, C.E.; Peacock, J.; Housner, J.; Zernicke, R.F.; Zendler, J.D. Experience does not influence injury-related joint kinematics and kinetics in distance runners. *Gait Posture* **2018**, *61*, 13–18. [CrossRef]
- 183. Amaro, A.M.; Paulino, M.F.; Neto, M.A.; Roseiro, L. Hand-Arm Vibration Assessment and Changes in the Thermal Map of the Skin in Tennis Athletes during the Service. *Int. J. Environ. Res. Public Health* **2019**, *16*, 5117. [CrossRef]
- 184. Chambon, N.; Delattre, N.; Guéguen, N.; Berton, E.; Rao, G. Is midsole thickness a key parameter for the running pattern? *Gait Posture* **2014**, *40*, 58–63. [CrossRef]
- 185. Barrett, S.; Midgley, A.; Reeves, M.; Joel, T.; Franklin, E.; Heyworth, R.; Garrett, A.; Lovell, R. The within-match patterns of locomotor efficiency during professional soccer match play: Implications for injury risk? *J. Sci. Med. Sport* **2016**, *19*, 810–815. [CrossRef]
- 186. Bessone, V.; Petrat, J.; Schwirtz, A. Ground Reaction Forces and Kinematics of Ski Jump Landing Using Wearable Sensors. *Sensors* **2019**, *19*, 2011. [CrossRef]
- 187. Boey, H.; Aeles, J.; Schütte, K.; Vanwanseele, B. The effect of three surface conditions, speed and running experience on vertical acceleration of the tibia during running*. *Sport. Biomech.* **2017**, *16*, 166–176. [CrossRef] [PubMed]
- 188. Willy, R.W.; Buchenic, L.; Rogacki, K.; Ackerman, J.; Schmidt, A.; Willson, J.D. In-field gait retraining and mobile monitoring to address running biomechanics associated with tibial stress fracture. *Scand. J. Med. Sci. Sport.* **2016**, *26*, 197–205. [CrossRef] [PubMed]
- 189. Bowen, L.; Gross, A.S.; Gimpel, M.; Li, F.X. Accumulated workloads and the acute: Chronic workload ratio relate to injury risk in elite youth football players. *Br. J. Sports Med.* **2017**, *51*, 452–459. [CrossRef] [PubMed]
- 190. Wood, C.M.; Kipp, K. Use of audio biofeedback to reduce tibial impact accelerations during running. *J. Biomech.* **2014**, 47, 1739–1741. [CrossRef]
- 191. Faherty, M.; Varnell, M.; Csonka, J.; Salesi, K.; Gomez, S.; Sell, T. Sex differences in lower extremity musculoskeletal and neuromuscular characteristics in intercollegiate soccer athletes. *Sci. Med. Footb.* **2020**, *4*, 45–51. [CrossRef]
- 192. Zhang, Z.; Zhang, Y.; Fu, W.; Wei, Z.; Jiang, J.; Wang, L. Plantar loads of habitual forefoot strikers during running on different overground surfaces. *Appl. Sci.* **2020**, *10*, 2271. [CrossRef]
- 193. Zhang, J.H.; Chan, Z.Y.S.; Au, I.P.H.; An, W.W.; Shull, P.B.; Cheung, R.T.H.O.Y. Transfer Learning Effects of Biofeedback Running Retraining in Untrained Conditions. *Med. Sci. Sports Exerc.* **2019**, *51*, 1904–1908. [CrossRef]
- 194. Zhang, J.H.; Chan, Z.Y.S.; Au, I.P.H.; An, W.W.; Cheung, R.T.H. Can runners maintain a newly learned gait pattern outside a laboratory environment following gait retraining? *Gait Posture* **2019**, *69*, 8–12. [CrossRef]
- 195. Zifchock, R.A.; Davis, I.; Hamill, J. Kinetic asymmetry in female runners with and without retrospective tibial stress fractures. *J. Biomech.* **2006**, 39, 2792–2797. [CrossRef]
- 196. Crowell, H.P.; Davis, I.S. Gait retraining to reduce lower extremity loading in runners. Clin. Biomech. 2011, 26, 78–83. [CrossRef]
- 197. Vallance, E.; Sutton-Charani, N.; Imoussaten, A.; Montmain, J.; Perrey, S. Combining internal- and external-training-loads to predict non-contact injuries in soccer. *Appl. Sci.* **2020**, *10*, 5261. [CrossRef]
- 198. Verbitsky, O.; Mizrahi, J.; Voloshin, A.; Treiger, J.; Isakov, E. Shock transmission and fatigue in human running. *J. Appl. Biomech.* **1998**, *14*, 300–311. [CrossRef] [PubMed]
- 199. Vila Dieguez, O.; Barden, J.M. Body roll differences in freestyle swimming between swimmers with and without shoulder pain. *Sport. Biomech.* **2020**, 1–14. [CrossRef] [PubMed]
- 200. Voloshin, A.S.; Bejjani, F.J.; Halpern, M.; Frankel, V.H. Dynamic loading on flamenco dancers: A biomechanical study. *Hum. Mov. Sci.* **1989**, *8*, 503–513. [CrossRef]
- 201. Voloshin, A.S. Effect of fatigue on the attenuational capacity of human musculoskeletal system. *J. Biomech.* **1994**, 27, 708. [CrossRef]
- 202. Esmaeili, A.; Hopkins, W.G.; Stewart, A.M.; Elias, G.P.; Lazarus, B.H.; Aughey, R.J. The individual and combined effects of multiple factors on the risk of soft tissue non-contact injuries in elite team sport athletes. *Front. Physiol.* **2018**, *9*, 1280. [CrossRef]
- 203. Wilkerson, G.B.; Gupta, A.; Allen, J.R.; Keith, C.M.; Colston, M.A. Utilization of practice session average inertial load to quantify college football injury risk. *J. Strength Cond. Res.* **2016**, *30*, 2369–2374. [CrossRef]
- 204. Wilkerson, G.B.; Gupta, A.; Colston, M.A. Mitigating Sports Injury Risks Using Internet of Things and Analytics Approaches. *Risk Anal.* **2018**, *38*, 1348–1360. [CrossRef]

Sensors **2022**, 22, 3225 31 of 33

205. Wellman, A.D.; Coad, S.C.; Goulet, G.C.; McLellan, C.P. Quantification of accelerometer derived impacts associated with competitive games in national collegiate athletic association division I college football players. *J. Strength Cond. Res.* **2017**, 31, 330–338. [CrossRef]

- 206. Supej, M.; Ogrin, J.; Holmberg, H.C. Whole-body vibrations associated with alpine skiing: A risk factor for low back pain? *Front. Psychiatry* **2018**, *9*, 204. [CrossRef]
- 207. Supej, M.; Ogrin, J. Transmissibility of whole-body vibrations and injury risk in alpine skiing. *J. Sci. Med. Sport* **2019**, 22, S71–S77. [CrossRef] [PubMed]
- 208. Swaminathan, R.; Williams, J.M.; Jones, M.D.; Theobald, P.S. A kinematic analysis of the spine during rugby scrummaging on natural and synthetic turfs. *J. Sports Sci.* **2016**, *34*, 1058–1066. [CrossRef] [PubMed]
- 209. Tenforde, A.S.; Hayano, T.; Jamison, S.T.; Outerleys, J.; Davis, I.S. Tibial Acceleration Measured from Wearable Sensors Is Associated with Loading Rates in Injured Runners. *PM R* **2020**, *12*, *679*–684. [CrossRef]
- 210. Thompson, M.; Seegmiller, J.; McGowan, C.P. Impact Accelerations of Barefoot and Shod Running. *Int. J. Sports Med.* **2016**, 37, 364–368. [CrossRef] [PubMed]
- 211. Townshend, A.D.; Franettovich Smith, M.M.; Creaby, M.W. The energetic cost of gait retraining: A pilot study of the acute effect. *Phys. Ther. Sport* **2017**, 23, 113–117. [CrossRef] [PubMed]
- 212. Tranquilli, C.; Bernetti, A.; Picerno, P. Ambulatory joint mobility and muscle strength assessment during rehabilitation using a single wearable inertial sensor. *Med. Dello Sport* **2013**, *66*, 583–597.
- 213. Feigenbaum, L.A.; Gaunaurd, I.A.; Kim, K.J.A.E.; Raya, M.A.; Ruiz, J.T.; Rapicavoli, J.; Best, T.M.; Kaplan, L.E.E.; Gailey, R.S. Accuracy of the Region of Limb Stability in Predicting Risk for Lower Limb Injury. *Med. Sci. Sports Exerc.* 2020, 52, 2483–2488. [CrossRef]
- 214. Ueberschär, O.; Fleckenstein, D.; Warschun, F.; Kränzler, S.; Walter, N.; Hoppe, M.W. Measuring biomechanical loads and asymmetries in junior elite long-distance runners through triaxial inertial sensors. *Sport. Orthop. Traumatol.* **2019**, *35*, 296–308. [CrossRef]
- 215. Sinclair, J.; Bottoms, L.; Taylor, P.J.; Mahmood, K. Effects of shoes on kinetics and kinematics of the squash forward lunge in male players. *Kinesiology* **2017**, *49*, 178–184. [CrossRef]
- 216. Sinclair, J.; Bottoms, L.; Taylor, K.; Greenhalgh, A. Tibial shock measured during the fencing lunge: The influence of footwear. *Sport. Biomech.* **2010**, *9*, 65–71. [CrossRef]
- 217. Sinclair, J.; Taylor, P.J.; Hobbs, S.J. Kinematic regulation of time and frequency domain components of accelerations measured at the tibia during heel-toe running. *Hum. Mov.* **2014**, *15*, 51–55. [CrossRef]
- 218. Slaughter, P.R.; Adamczyk, P.G. Tracking quantitative characteristics of cutting maneuvers with wearable movement sensors during competitive women's ultimate frisbee games. *Sensors* **2020**, *20*, 6508. [CrossRef] [PubMed]
- 219. Spörri, J.; Kröll, J.; Fasel, B.; Aminian, K.; Müller, E. The use of body worn sensors for detecting the vibrations acting on the lower back in alpine ski racing. *Front. Physiol.* **2017**, *8*, 522. [CrossRef] [PubMed]
- 220. Spörri, J.; Kröll, J.; Fasel, B.; Aminian, K.; Müller, E. Course Setting as a Prevention Measure for Overuse Injuries of the Back in Alpine Ski Racing: A Kinematic and Kinetic Study of Giant Slalom and Slalom. *Orthop. J. Sport. Med.* **2016**, *4*, 1–8. [CrossRef]
- 221. Spörri, J.; Kröll, J.; Fasel, B.; Aminian, K.; Müller, E. Standing Height as a Prevention Measure for Overuse Injuries of the Back in Alpine Ski Racing: A Kinematic and Kinetic Study of Giant Slalom. *Orthop. J. Sport. Med.* **2018**, *6*, 1–7. [CrossRef]
- 222. Spörri, J.; Kröll, J.; Haid, C.; Fasel, B.; Müller, E. Potential Mechanisms Leading to Overuse Injuries of the Back in Alpine Ski Racing: A Descriptive Biomechanical Study. *Am. J. Sports Med.* **2015**, *43*, 2042–2048. [CrossRef]
- 223. Setuain, I.; Bikandi, E.; Amú-Ruiz, F.A.; Izquierdo, M. Horizontal jumping biomechanics among elite male handball players with and without anterior cruciate ligament reconstruction. An inertial sensor unit-based study. *Phys. Ther. Sport* **2019**, *39*, 52–63. [CrossRef]
- 224. Fu, W.; Liu, Y.; Zhang, S. Effects of footwear on impact forces and soft tissue vibrations during drop jumps and unanticipated drop landings. *Int. J. Sports Med.* **2013**, *34*, 477–483. [CrossRef]
- 225. Setuain, I.; Bikandi, E.; Amú Ruiz, F.A.; Urtasun, F.; Izquierdo, M. Horizontal jumping biomechanics among elite female handball players with and without anterior cruciate ligament reconstruction: An ISU based study. *BMC Sports Sci. Med. Rehabil.* **2019**, 11, 30. [CrossRef]
- 226. Setuain, I.; Millor, N.; González-Izal, M.; Gorostiaga, E.M.; Gómez, M.; Alfaro-Adrián, J.; Maffiuletti, N.A.; Izquierdo, M. Biomechanical jumping differences among elite female handball players with and without previous anterior cruciate ligament reconstruction: A novel inertial sensor unit study. *Sport. Biomech.* **2015**, *14*, 323–339. [CrossRef]
- 227. Setuain, I.; González-Izal, M.; Alfaro, J.; Gorostiaga, E.; Izquierdo, M. Acceleration and Orientation Jumping Performance Differences Among Elite Professional Male Handball Players with or Without Previous ACL Reconstruction: An Inertial Sensor Unit-Based Study. *PM R* **2015**, *7*, 1243–1253. [CrossRef] [PubMed]
- 228. Setuain, I.; Lecumberri, P.; Izquierdo, M. Sprint mechanics return to competition follow-up after hamstring injury on a professional soccer player: A case study with an inertial sensor unit based methodological approach. *J. Biomech.* **2017**, *63*, 186–191. [CrossRef] [PubMed]
- 229. Sheerin, K.R.; Reid, D.; Taylor, D.; Besier, T.F. The effectiveness of real-time haptic feedback gait retraining for reducing resultant tibial acceleration with runners. *Phys. Ther. Sport* **2020**, *43*, 173–180. [CrossRef] [PubMed]

Sensors **2022**, 22, 3225 32 of 33

230. Sheerin, K.R.; Besier, T.F.; Reid, D. The influence of running velocity on resultant tibial acceleration in runners. *Sport. Biomech.* **2020**, *19*, 750–760. [CrossRef] [PubMed]

- 231. Simons, C.; Bradshaw, E.J. Do accelerometers mounted on the back provide a good estimate of impact loads in jumping and landing tasks? *Sport. Biomech.* **2016**, *15*, 76–88. [CrossRef]
- 232. Rojas-Valverde, D.; Sánchez-Ureña, B.; Pino-Ortega, J.; Gómez-Carmona, C.; Gutiérrez-Vargas, R.; Timón, R.; Olcina, G. External workload indicators of muscle and kidney mechanical injury in endurance trail running. *Int. J. Environ. Res. Public Health* **2019**, 16, 3909. [CrossRef]
- 233. Rosero-Montalvo, P.D.; Dibujes, A.; Vásquez-Ayala, C.; Umaquinga-Criollo, A.; Michilena, J.R.; Suaréz, L.; Flores, S.; Jaramillo, D. Intelligent System of Squat Analysis Exercise to Prevent Back Injuries. *Adv. Intell. Syst. Comput.* **2019**, *884*, 193–205. [CrossRef]
- 234. Sampson, J.A.; Murray, A.; Williams, S.; Halseth, T.; Hanisch, J.; Golden, G.; Fullagar, H.H.K. Injury risk-workload associations in NCAA American college football. *J. Sci. Med. Sport* **2018**, *21*, 1215–1220. [CrossRef]
- 235. Lafortune, M.A. Three-dimensional acceleration of the tibia during walking and running. J. Biomech. 1991, 24, 877–886. [CrossRef]
- 236. Udby, C.L.; Impellizzeri, F.M.; Lind, M.; Nielsen, R.Ø. How has workload been defined and how many workload-related exposures to injury are included in published sports injury articles? A scoping review. *J. Orthop. Sports Phys. Ther.* **2020**, 50, 538–548. [CrossRef]
- 237. Kalkhoven, J.T.; Watsford, M.L.; Coutts, A.J.; Edwards, W.B.; Impellizzeri, F.M. Training Load and Injury: Causal Pathways and Future Directions. *Sport. Med.* **2021**, *51*, 1137–1150. [CrossRef] [PubMed]
- 238. West, S.W.; Clubb, J.; Torres-Ronda, L.; Howells, D.; Leng, E.; Vescovi, J.D.; Carmody, S.; Posthumus, M.; Dalen-Lorentsen, T.; Windt, J. More than a Metric: How Training Load is Used in Elite Sport for Athlete Management. *Int. J. Sport Med.* 2021, 42, 300–306. [CrossRef] [PubMed]
- 239. Passfield, L.; Murias, J.; Sacchetti, M.; Nicolò, A. Validity of the Training Load Concept. *Int. J. Sports Physiol. Perform.* **2022**, 17, 507–514. [CrossRef]
- 240. Fonseca, S.T.; Souza, T.R.; Verhagen, E.; van Emmerik, R.; Bittencourt, N.F.N.; Mendonça, L.D.M.; Andrade, A.G.P.; Resende, R.A.; Ocarino, J.M. Sports Injury Forecasting and Complexity: A Synergetic Approach. Sport Med. 2020, 50, 1757–1770. [CrossRef] [PubMed]
- 241. McKay, A.K.A.; Stellingwerff, T.; Smith, E.S.; Martin, D.T.; Mujika, I.; Goosey-Tolfrey, V.L.; Sheppard, J.; Burke, L.M. Defining Training and Performance Caliber: A Participant Classification Framework. *Int. J. Sports Physiol. Perform.* 2022, 17, 317–331. [CrossRef] [PubMed]
- 242. Collection Générale des Décrets Rendus par la Convention Nationale; Paris, Chez Baudouin; Imprimeur de l'Assemblée Nationale: 1789–1794. Available online: https://gallica.bnf.fr/ark:/12148/bpt6k9659818w.texteImage (accessed on 21 January 2022).
- 243. Seel, T.; Kok, M.; McGinnis, R.S. Inertial sensors—Applications and challenges in a nutshell. *Sensors* **2020**, *20*, 6221. [CrossRef] [PubMed]
- 244. Potter, M.V.; Ojeda, L.V.; Perkins, N.C.; Cain, S.M. Effect of IMU Design on IMU-Derived Stride Metrics for Running. *Sensors* **2019**, 19, 2601. [CrossRef]
- 245. Mitschke, C.; Kiesewetter, P.; Milani, T.L. The Effect of the Accelerometer Operating Range on Biomechanical Parameters: Stride Length, Velocity, and Peak Tibial Acceleration during Running. *Sensors* **2018**, *18*, 130. [CrossRef]
- 246. Sabatini, A.M. Estimating three-dimensional orientation of human body parts by inertial/magnetic sensing. *Sensors* **2011**, 11, 1489–1525. [CrossRef]
- 247. Bergamini, E.; Ligorio, G.; Summa, A.; Vannozzi, G.; Cappozzo, A.; Sabatini, A.M. Estimating orientation using magnetic and inertial sensors and different sensor fusion approaches: Accuracy assessment in manual and locomotion tasks. *Sensors* **2014**, 14, 18625–18649. [CrossRef]
- 248. Picerno, P.; Cereatti, A.; Cappozzo, A. A spot check for assessing static orientation consistency of inertial and magnetic sensing units. *Gait Posture* **2011**, *33*, 373–378. [CrossRef] [PubMed]
- 249. Ligorio, G.; Bergamini, E.; Pasciuto, I.; Vannozzi, G.; Cappozzo, A.; Sabatini, A.M. Assessing the performance of sensor fusion methods: Application to magnetic-inertial-based human body tracking. *Sensors* **2016**, *16*, 153. [CrossRef] [PubMed]
- 250. Bachmann, E.; Yun, X.; Peterson, C. An investigation of the effects of magnetic variations on inertial/magnetic orientation sensors. In Proceedings of the IEEE International Conference on Robotics and Automation, New Orleans, LA, USA, 26 April–1 May 2004; pp. 1115–1122.
- 251. de Vries, W.H.K.; Veeger, H.E.J.; Baten, C.T.M.; van der Helm, F.C.T. Magnetic distortion in motion labs, implications for validating inertial magnetic sensors. *Gait Posture* **2009**, *29*, 535–541. [CrossRef] [PubMed]
- 252. Camomilla, V.; Dumas, R.; Cappozzo, A. Human movement analysis: The soft tissue artefact issue. *J. Biomech.* **2017**, *62*, 1–4. [CrossRef] [PubMed]
- 253. Liu, T.; Inoue, Y.; Shibata, K. Measurement of soft tissue deformation to improve the accuracy of a body-mounted motion sensor. *J. Med. Device.* **2009**, *3*, 035001. [CrossRef]
- 254. Scalera, G.M.; Ferrarin, M.; Marzegan, A.; Rabuffetti, M. Assessment of Stability of MIMU Probes to Skin-Marker-Based Anatomical Reference Frames during Locomotion Tasks: Effect of Different Locations on the Lower Limb. *Front. Bioeng. Biotechnol.* **2021**, *9*, 721900. [CrossRef]

Sensors **2022**, 22, 3225 33 of 33

255. Cereatti, A.; Bonci, T.; Akbarshahi, M.; Aminian, K.; Barré, A.; Begon, M.; Benoit, D.L.; Charbonnier, C.; Dal Maso, F.; Fantozzi, S.; et al. Standardization proposal of soft tissue artefact description for data sharing in human motion measurements. *J. Biomech.* 2017, 62, 5–13. [CrossRef]

- 256. Nokes, L.; Fairclough, J.A.; Mintowt-Czyz, W.J.; Mackie, I.; Williams, J. Vibration analysis of human tibia: The effect of soft tissue on the output from skin-mounted accelerometers. *J. Biomed. Eng.* **1984**, *6*, 223–226. [CrossRef]
- 257. Forner-Cordero, A.; Mateu-Arce, M.; Forner-Cordero, I.; Alcántara, E.; Moreno, J.C.; Pons, J.L. Study of the motion artefacts of skin-mounted inertial sensors under different attachment conditions. *Physiol. Meas.* **2008**, 29, 21–31. [CrossRef]
- 258. Decker, C.; Prasad, N.; Kawchuk, G.N. The reproducibility of signals from skin-mounted accelerometers following removal and replacement. *Gait Posture* **2011**, *34*, 432–434. [CrossRef]
- 259. Norris, M.; Kenny, I.C.; Anderson, R. Comparison of accelerometry stride time calculation methods. *J. Biomech.* **2016**, *49*, 3031–3034. [CrossRef] [PubMed]
- 260. Cazzola, D.; Trewartha, G.; Preatoni, E. Time-based calibrations of pressure sensors improve the estimation of force signals containing impulsive events. *Proc. Inst. Mech. Eng. Part P J. Sport. Eng. Technol.* **2014**, 228, 147–151. [CrossRef]
- 261. Cereatti, A.; Della Croce, U.; Sabatini, A.M. Three-Dimensional Human Kinematic Estimation Using Magneto-Inertial Measurement Units. In *Handbook of Human Motion*; Müller, B., Wolf, S.I., Brueggemann, G.-P., Deng, Z., McIntosh, A., Miller, F., Selbie, W.S., Eds.; Springer International Publishing: Cham, Switzerland, 2017; pp. 1–24. ISBN 978-3-319-30808-1.
- Pacher, L.; Chatellier, C.; Vauzelle, R.; Fradet, L. Sensor-to-Segment Calibration Methodologies for Lower–Body Kinematic Analysis with Inertial Sensors: A Systematic Review. Sensors 2020, 20, 3322. [CrossRef] [PubMed]
- 263. The Road Not Taken: A Selection of Robert Frost's Poems. Available online: https://www.poetryfoundation.org/poems/44272/the-road-not-taken (accessed on 3 March 2022).
- 264. Cust, E.E.; Sweeting, A.J.; Ball, K.; Robertson, S. Machine and deep learning for sport-specific movement recognition: A systematic review of model development and performance. *J. Sports Sci.* 2019, *37*, 568–600. [CrossRef] [PubMed]
- 265. Claudino, J.G.; de Capanema, D.O.; de Souza, T.V.; Serrão, J.C.; Machado Pereira, A.C.; Nassis, G.P. Current Approaches to the Use of Artificial Intelligence for Injury Risk Assessment and Performance Prediction in Team Sports: A Systematic Review. *Sport. Med. Open* **2019**, *5*, 28. [CrossRef]
- 266. Whelan, D.; O'Reilly, M.; Huang, B.; Giggins, O.; Kechadi, T.; Caulfield, B. Leveraging IMU data for accurate exercise performance classification and musculoskeletal injury risk screening. In Proceedings of the 2016 38th Annual International Conference of the IEEE Engineering in Medicine and Biology Society (EMBC), Orlando, FL, USA, 16–20 August 2016; pp. 659–662.
- 267. Clermont, C.A.; Duffett-Leger, L.; Hettinga, B.A.; Ferber, R. Runners' Perspectives on 'Smart' Wearable Technology and Its Use for Preventing Injury. *Int. J. Hum. Comput. Interact.* **2020**, *36*, 31–40. [CrossRef]
- 268. Yu, M.; Jin, J.; Wang, X.; Yu, X.; Zhan, D.; Gao, J. Development and Design of Flexible Sensors Used in Pressure-Monitoring Sports Pants for Human Knee Joints. *IEEE Sens. J.* **2021**, *21*, 25400–25408. [CrossRef]