Introduction

Basketball is a popular team sport and has gained significant interest from sport science researchers over the years. During a 40-min basketball game, players actively cover a distance of 5–6 km, involving repeated shuffling, jump-landing, and sprinting; all of which warrant the classification of basketball as a high-intensity intermittent sport [1]. Meanwhile, basketball players can experience severe injuries, especially in the ankle and knee [2]. One of the common acute injuries is that of the anterior cruciate ligament, especially in female high school athletes [3]. Overuse injuries of the knee are...
also relatively common in basketball [4]. An increase in the mechanical load owing to specific movement can induce acute injuries [5], or the accumulation of mechanical load from repetitive movements can induce overuse injuries [6]; it is therefore essential to examine its effects on athletic performance and the occurrence of injuries during high-intensity movements.

The mechanical load experienced by an athlete during training and basketball games can be further categorized as either internal or external load, also known as physiological or biomechanical load [7]. Measures of internal (physiological) load include oxygen uptake, heart rate, blood lactate, and RPE; whereas those of external (biomechanical) load include the joint contact force and muscle-tendon force. These measures can be obtained using various devices in a laboratory-based environment, but are often difficult to collect during live sports events. Representative external load measures are often based on data obtained from GPS devices, which can measure variables such as running distance and velocity, or other physiologically relevant proxies for energy consumption [7]. However, accelerations and decelerations come at a greater energetic cost than maintaining a constant speed; they also induce a higher biomechanical load on the musculoskeletal system [8]. As such biomechanical loads cannot be estimated from distance or velocity data, GPS devices must also be able to quantify acceleration and deceleration. However, the accuracy of GPS-based acceleration signals remains limited [9]. Therefore, acceleration data measured using an accelerometer have been used as an external biomechanical index [10–12]. Recently, although “player load” has been used as an index of measured acceleration in basketball [13, 14], it is unknown what type of movements show high acceleration and deceleration. However, the accuracy of GPS-based acceleration signals remains limited [9]. Therefore, acceleration data measured using an accelerometer have been used as an external biomechanical index [10–12]. Recently, although “player load” has been used as an index of measured acceleration in basketball [13, 14], it is unknown what type of movements show high acceleration and deceleration. Acceleration was measured at a frequency of 200 Hz and saved in the built-in memory of the accelerometer. The axial direction of the accelerometer was set at +1 G, indicating acceleration due to gravity.

No unified view has been obtained on an index of acceleration. Peak resultant acceleration (PRA) is an index measure reflecting high-impact movements, gender differences, and stiff cutting movements [15]; it is also correlated with ground reaction force [11]. In volleyball, PRA also reflects individual differences in jumping and non-jumping movements [10]; whereas in badminton, the frequency and details of high-impact movements were estimated using PRA [16]. In addition, examining each directional acceleration could show characteristics of movements. In basketball, quantifying the frequency and details of high-impact movements while playing could help in estimating the biomechanical load.

This study aimed to identify details of play and movements with high impact showing greater resultant acceleration and the frequency of these movements during a female basketball match. We hypothesized that defense reaction to opponents and shot with landing are details of play with high impact showing greater accelerations and that deceleration and landing are frequently detected high-impact movements.

Materials and Methods

Participants
In total, eight teenage female basketball players [age, 16.1 ± 0.6 years; body mass, 53.6 ± 6.3 kg; height, 159.8 ± 4.8 cm; years of experience, 5.9 ± 1.6 years (mean ± SD)] were recruited for this experiment. The competition level of participants was set at prefectures ranking 4th–8th in Japan. The playing positions of participants were: guard (n = 2), shooting guard (n = 1), guard/forward (n = 1), forward (n = 2), and center (n = 1). Physical evaluations were conducted, which provided the basis for inclusion and exclusion criteria. Players were excluded if they had a history of severe musculoskeletal injury or if they suffered from any musculoskeletal injury within the past three months, as well as any disorder interfering with sensory input, musculoskeletal function, and motor function. Before the start of the study, all participants and their legal guardians provided written informed consent according to the requirements of the ethical review board of the authors’ affiliation. The study meets the ethical standards of the journal [17].

Measurements

Linear acceleration was measured using a lightweight, triaxial accelerometer with a full-scale range of ±16 G (SS-WS1201; Sports Sensing, Fukuoka, Japan). The accelerometer was secured to the upper back of the participant using an exclusive vest with compressive innerwear that did not limit upper or lower limb movements. This study aimed to identify details of play and movements with high impact showing greater acceleration and the frequency (case/min) and the ratio of the acceleration threshold, the frequency (case/min) and the ratio of the detected acceleration data. The above acceleration thresholds were temporarily used to examine the ratio of corresponding detected details of play and movements. We categorized the extracted instance as details of play and movements based on ▶ Table 1. For each acceleration threshold, the frequency (case/min) and the ratio of the detected details of play and movements was calculated. Categorization was performed by two researchers who needed to reach a unanimous decision; if they disagreed, other researchers were consulted to obtain a consensus and final decision. Additionally, the top seven basketball-specific movements, pair of movements and de-
tails of play observed > 6 G, were summarized, and the average resultant and each directional acceleration were calculated. In vertical acceleration, a positive value indicates an upward direction, whereas in anteroposterior acceleration, it indicated a posterior direction. For mediolateral acceleration, absolute values were used to eliminate the influence of the dominant hand.

Statistical analysis

The 95% confidence interval was calculated for all frequencies using the following formula: movement rate ± 1.96 × [movement rate/√(number of movements)] [18] to evaluate differences among the identified details of play and among the detected movements. We also compared the resultant and directional acceleration (mediolateral, vertical, and anteroposterior) of the top seven basketball-specific movements using two-way ANOVA (movements × subjects) to examine the main effect of movements and interaction, along with Bonferroni correction as a post hoc test for the variables with significant main effects of movements. To assess the number of cases required to determine significant differences of two-way ANOVA for the top seven basketball-specific movements, a power analysis was performed at f = 0.4 and ρ = 0.05, power = 0.8, numerator df = 42, and number of groups = 56. The analysis showed that a frequency of 209 was required to achieve sufficient statistical power to detect significant differences between movement types.

Results

A total of 1062 and 223 details of play were detected for the resultant acceleration thresholds of > 6 and > 8 G, respectively (> Table 2). For both acceleration thresholds (> 6 and > 8 G), positioning on the half-court (29.6 and 23.8%, respectively), running on the full court (25.8 and 22.4%, respectively), and defense (16.5 and 18.8%, respectively) were the most frequently observed details of play. The ratio and frequency of detected movements at each resultant acceleration threshold (> 6 and > 8 G) are shown in > Table 3. Deceleration was the most frequently detected movement at both acceleration thresholds (21.5 and 23.3%, respectively), followed by landing (7.6 and 15.7%, respectively), the ratio of which was increased with increasing threshold.

The seven most common basketball-specific movements generating > 6 G were deceleration during positioning on the half-court, deceleration during defense, cutting during positioning on the half-court, landing during a shot, lunging during a pass, sides-steps during defense, and cutting during defense. The descriptive statistics of the resultant mediolateral, vertical, and anteroposterior accelerations for the seven most common basketball-specific movements are shown in > Table 4. The two-way ANOVA summary for movements and subjects as factors for each resultant acceleration threshold are presented in > Table 5. Movements alone showed only a significant main effect in mediolateral acceleration, whereas significant interactions were observed in all accelerations. In mediolateral acceleration, the post hoc test showed that “sides-steps during defense” was significantly higher than other basketball-specific movements (ρ < 0.001 for “deceleration during positioning on the half-court,” “deceleration during defense,” “cutting during positioning on the half-court,” and “landing during a shot;” ρ < 0.01 for “cutting during defense” and ρ < 0.05 for “lunging dur-

> Table 1 Categorization of details of play and movements.

| Details of play | Movements       |
|----------------|----------------|
| Positioning on half court | Deceleration |
| Running on full court  | Landing       |
| Defense            | Cutting       |
| Shot              | Take-off      |
| Pass              | Lunging       |
| Pass catch         | Sidesteps     |
| Rebound            | Stopping      |
| Shot block         | Physical contact |
| Dribbling          | Etc. (including running) |
| Etc.               | Unknown       |
| Unknown            |                |

> Table 2 Details of play generated > 6 and > 8 G during basketball game.

| Movement                        | > 6 G | > 8 G |
|---------------------------------|-------|-------|
|                                 | Counts (cases) | Ratio (%) | Frequency (cases/min) 95 % C.I. | Counts (cases) | Ratio (%) | Frequency (cases/min) 95 % C.I. |
|---------------------------------|-------|-------|
| Positioning on the half-court   | 314   | 29.6  | 1.73 (1.54–1.93) | 53     | 23.8  | 0.29 (0.21–0.37) |
| Running on full court           | 274   | 25.8  | 1.51 (1.33–1.69) | 50     | 22.4  | 0.28 (0.20–0.35) |
| Defense                         | 175   | 16.5  | 0.97 (0.82–1.11) | 42     | 18.8  | 0.23 (0.16–0.30) |
| Shot                            | 63    | 5.9   | 0.35 (0.26–0.43) | 28     | 12.6  | 0.15 (0.10–0.21) |
| Pass                            | 53    | 5.0   | 0.29 (0.21–0.37) | 16     | 7.2   | 0.09 (0.05–0.13) |
| Pass catch                      | 35    | 3.3   | 0.19 (0.13–0.26) | 6      | 2.7   | 0.03 (0.01–0.06) |
| Rebound                         | 32    | 3.0   | 0.18 (0.12–0.24) | 9      | 4.0   | 0.05 (0.02–0.08) |
| Shot block                      | 31    | 2.9   | 0.17 (0.11–0.23) | 10     | 4.5   | 0.06 (0.02–0.09) |
| Dribbling                       | 16    | 1.5   | 0.09 (0.05–0.13) | 0      | 0.0   | 0.00 (0.00–0.00) |
| Etc.                            | 6     | 0.6   | 0.03 (0.01–0.06) | 1      | 0.4   | 0.01 (~0.01–0.02) |
| Unknown                         | 63    | 5.9   | 0.35 (0.26–0.43) | 8      | 3.6   | 0.04 (0.01–0.08) |
| Total                           | 1062  | 100.0 | 5.86 (5.51–6.21) | 223    | 100.0 | 1.23 (1.07–1.39) |
“Lunging during a pass” was significantly higher than “landing during a shot” \( (p < 0.05) \).

**Discussion**

This study revealed the frequency and ratio of high-impact movements with greater trunk acceleration during a basketball game. We selected trunk acceleration as a variable indicating external load because it is a reliable measure for GRF [11] and did not prevent upper or lower limb movement during measurements. Because the trunk is the body segment with the highest mass, attaching an accelerometer to it provides the most accurate measure of whole-body acceleration [7]. Our findings show that high-impact movements with greater acceleration mostly involved deceleration and landing, whereas the details of play consisting of high-impact movements were positioning on the half-court, running on the full half-court, cutting and jumping.

### Table 3

| Movement                     | > 6 G | > 8 G |
|------------------------------|-------|-------|
|                              | Counts (cases) | Ratio (%) | Frequency (cases/min) 95% C.I. | Counts (cases) | Ratio (%) | Frequency (cases/min) 95% C.I. |
| Deceleration                 | 228   | 21.5  | 1.26 (1.09–1.42) | 52     | 23.3  | 0.29 (0.21–0.37) |
| Landing                      | 81    | 7.6   | 0.45 (0.35–0.55)  | 35     | 15.7  | 0.19 (0.13–0.26)  |
| Cutting                      | 79    | 7.4   | 0.44 (0.34–0.53)  | 11     | 4.9   | 0.06 (0.02–0.10)  |
| Take-off                     | 76    | 7.2   | 0.42 (0.33–0.51)  | 19     | 8.5   | 0.10 (0.06–0.15)  |
| Lunging                      | 47    | 4.4   | 0.26 (0.19–0.33)  | 15     | 6.7   | 0.08 (0.04–0.13)  |
| Sidesteps                    | 38    | 3.6   | 0.21 (0.14–0.28)  | 9      | 4.0   | 0.05 (0.02–0.08)  |
| Stopping                     | 37    | 3.5   | 0.20 (0.14–0.27)  | 3      | 1.3   | 0.02 (0.00–0.04)  |
| Physical contact             | 22    | 2.1   | 0.12 (0.07–0.17)  | 9      | 4.0   | 0.05 (0.02–0.08)  |
| Etc.                         | 391   | 36.8  | 2.16 (1.94–2.37)  | 62     | 27.8  | 0.34 (0.26–0.43)  |
| Unknown                      | 63    | 5.9   | 0.35 (0.26–0.43)  | 8      | 3.6   | 0.04 (0.01–0.08)  |
| Total                        | 1062  | 100.0 | 5.86 (5.51–6.21)  | 223    | 100.0 | 1.23 (1.07–1.39)  |

### Table 4

| Basketball-specific movements | Counts (cases) | Resultant (G) | Mediolateral (G) | Vertical (G) | Anteroposterior (G) |
|-------------------------------|----------------|---------------|------------------|--------------|---------------------|
| Deceleration during positioning on the half-court | 147 | 7.23 (1.14) | 1.02 (0.74) | 6.95 (1.86) | 1.10 (0.80) |
| Deceleration during defense | 54 | 7.34 (1.09) | 1.21 (0.82) | 6.99 (1.16) | 1.33 (1.03) |
| Cutting during positioning on half-court | 49 | 6.96 (0.86) | 1.44 (0.79) | 6.53 (0.90) | 1.46 (0.90) |
| Landing during a shot | 43 | 8.21 (1.85) | 1.03 (0.90) | 7.70 (1.60) | 2.10 (1.64) |
| Lunging during a pass | 26 | 7.48 (1.71) | 1.73 (1.13) | 6.95 (1.86) | 1.30 (1.17) |
| Sidesteps during defense | 24 | 7.94 (2.05) | 2.57 (2.47) | 6.29 (3.03) | 0.88 (2.41) |
| Cutting during defense | 22 | 7.20 (1.27) | 1.47 (0.85) | 6.81 (1.23) | 1.56 (0.67) |

### Table 5

| Variables | Factor | SS | df | MS | F-value | P-value | \( \eta^2 \) |
|-----------|--------|----|----|----|---------|---------|-----------|
| Resultant | Movement (M) | 9  | 6  | 1.48 | 0.7 | N. S. | 0.06 |
| Subject (S) | 16 | 7 | 2.33 | 1.1 | N. S. | 0.10 |
| M*S | 92 | 38 | 2.42 | 1.5 | <0.005 | 0.15 |
| Mediolateral | Movement (M) | 26 | 6 | 4.34 | 2.9 | <0.005 | 0.24 |
| Subject (S) | 59 | 7 | 8.48 | 5.9 | <0.001 | 0.41 |
| M*S | 68 | 38 | 1.78 | 2.2 | <0.001 | 0.21 |
| Vertical | Movement (M) | 11 | 6 | 1.91 | 0.6 | N. S. | 0.06 |
| Subject (S) | 13 | 7 | 1.81 | 0.6 | N. S. | 0.06 |
| M*S | 140 | 38 | 3.68 | 2.0 | <0.001 | 0.19 |
| Anteroposterior | Movement (M) | 17 | 6 | 2.85 | 1.6 | N. S. | 0.14 |
| Subject (S) | 30 | 7 | 4.26 | 2.4 | <0.05 | 0.22 |
| M*S | 82 | 38 | 2.16 | 2.0 | <0.001 | 0.20 |
court, and defense. In terms of basketball-specific play, deceleration during positioning on the half-court, deceleration during defense, cutting during positioning on the half-court, landing during a shot, lunging during a pass, sidesteps during defense, and cutting during defense were all detected. Monitoring the frequency and intensity of these details of play and movements could quantify the external biomechanical load.

Deceleration was mostly detected as high-impact movement. According to our results, positioning on the half-court and defense are mostly associated with deceleration. “Positioning on the half-court” is mainly the off-ball play during the offense. Deceleration was found to occur frequently during both offensive and defensive play. Decelerations demand intense eccentric and quasi-isometric contractions [19]. Deceleration volumes and intensities define the extent of tissue damage [20, 21] and subsequent injury risk [22]. It is thought that coordination or control of loading during deceleration is essential to basketball conditioning.

Landing mostly after a shot was also detected as a frequent high-impact movement. Additionally, the ratio of detected movements increased when the threshold exceeded 8 G. The relative duration of movements during a typical basketball game was about 2% for jumps and 9.3% for high shuffle movements [1, 23]. Although the ratio of landing after a jump in previous studies [1, 23] was low, a greater ratio was detected than other high-impact movements in this study, particularly in the high resultant acceleration threshold (8 G). When a player lands, as they focus on the ball and goal above their head, the acceleration is thought to be greater, because landing in an upright posture increases GRF [24]. Moreover, in volleyball, jumper’s knee injuries are caused by repeated load, which occurs mostly during landing [6]. Knee overuse injuries are also common in young basketball players [4]. Therefore, control of loading during the landing phase is important for basketball conditioning, although the frequency of landing was not greater than deceleration.

While comparing the seven most commonly detected basketball-specific high-impact movements in this study, we observed a significant main effect in mediolateral acceleration. The result showed that “side steps during defense” demonstrated higher mediolateral impact, which is a reasonable result assuming the characteristics of sidesteps. However, we also observed a significant interaction, suggesting high inter-player differences. The resultant and directional accelerations further demonstrated the characteristics of a player and not those of movement. It means that a particular player, and not all players, shows high acceleration in a specific movement. Therefore, characteristics of movements or playing style and playing position might have an effect on acceleration patterns during a basketball game. Moreover, these measures might demonstrate the training load or injury risk of each player. In a future study, the relationships between these measures and the player’s condition should be examined.

As a practical implication, considering the result of this study, the necessity to control the high-impact load during deceleration and landing is suggested. One way is to decrease the magnitude and frequency of these movements. The impact could be decreased by acquiring more flex posture [24], and injuries may decrease by acquiring this posture with prevention training [25]. Another way is to avoid the sudden increase in loading. Because the increase in

the load of acute/chronic ratio is a risk for overuse injury [26], it is necessary to design the practice and game plan such that it does not suddenly increase high-impact deceleration and landing movement.

Despite these results, this study had some limitations. First, we measured movements only in a simulated basketball match from a single team. The level of participants, gender, details of matches, fatigue, or floor material might have effects on acceleration. Second, the present study was a cross-sectional study. To prove the relationship between trunk acceleration and condition, a prospective cohort study is required. It is particularly important to determine which index and threshold are associated with injuries.

Acknowledgments

The authors would like to thank Enago for the English language review.

Conflict of Interest

The authors declare that they have no conflict of interest.

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