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Using wet‑bulb globe temperature OPEN meters to examine the efect of heat on various tennis court surfaces

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In this study, we evaluated the thermal environments of diferent tennis courts using wet-bulb globe temperature (WBGT) meters. WBGT meters were installed in an outdoor hard court, sand-flled artifcial grass court, and clay court (a softball feld), and measurements were taken hourly from 9:00 to 17:00 on weekdays from June 1 to September 21, 2022. The results were compared with data from diferent courts and the nearest Japan Meteorological Agency station (JMA WBGT) based on the Japan Sports Association's guidelines for exercise to prevent heat stroke. The median WBGT on each court was signifcantly higher for hard courts at the "Warning" (25≤JMA WBGT< 28) level or above, sandflled artifcial grass courts at the "Severe Warning" (28 ≤JMA WBGT< 31) level or above, and clay courts at the "Danger" (31 ≤JMA WBGT) level than the JMA WBGT. Compared with the JMA WBGT, hard and sand-flled artifcial grass courts are played on under particularly hot conditions. The results of this study could indicate to tournament organizers and coaches the importance of measuring the WBGT on each court surface from an early stage to prevent heat-related incidents.

Keywords Wet-bulb globe temperature, Tennis court surface, Thermal environment, Heat-related illness

In tennis competitions, multiple matches are played on a single day, lasting as long as five hours^{[1](#page-7-0)}. Moreover, among the four major tournaments designated by the International Tennis Federation (ITF), the temperatures at the Australian Open and US Open can exceed 35 °C. Furthermore, the Tokyo 2020 Olympic Games (Tokyo Olympics) in 2021 faced extremely hot conditions, with many players calling for adequate countermeasures²⁻⁴. Consequently, the ITF formulated and issued the "Extreme Weather Policy" at the Tokyo Olympics to provide guidelines for match management based on the temperature^{[5](#page-7-3)}. However, heat-related illnesses, such as heatstroke, are still considered a major problem in tennis.

Tennis matches and practices are played on various court surfaces. In the 2022 junior division of international tournaments organized by the ITF, 437 tournaments (55.7%) were played on hard courts, 323 (41.2%) on clay courts, 20 (2.6%) on carpeted courts (including sand-flled artifcial grass courts), and four (0.5%) on natural grass courts. Hard and clay courts account for most of those used in international tournaments^{[6](#page-7-4)}. However, among the junior international, national, and major qualifying tournaments in Japan, 74 tournaments (71.2%) were played on sand-flled artifcial grass courts (including three tournaments on artifcial grass courts), 23 (22.1%) on hard courts, and seven (6.7%) on clay courts in 2022, with sand-flled artifcial grass courts accounting for approximately 70[%7](#page-7-5) . Sand-flled artifcial grass courts are characterized by low stress on the legs and hips, good drainage, and ease of maintenance, even in light rain. Three types of surfaces are used in Japan: hard, sand-filled artifcial grass and clay courts.

During matches and practices in hot environments, players are subjected to thermal loads from solar radiation, reflected solar radiation, and ground surface radiation⁸. These effects can differ depending on the surface material being used. Previous studies have reported that diferent playing surfaces and surrounding environments

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constitute diverse microclimatic environments^{9,[10](#page-7-8)} that may differ from established weather stations^{[11](#page-7-9)}. The wetbulb globe temperature (WBGT) is an index used to measure the thermal environment calculated from wet-bulb, black-bulb, and dry-bulb temperatures and was proposed by Yaglow and Minard in 1957¹². The WBGT has been reported to be highly correlated with heat stroke^{[13](#page-7-11)} and can be used to prevent it. The WBGT was ISO-approved in 198[914](#page-7-12), and the Japan Sports Association published the Heat Stroke Prevention Exercise Guidelines in 1994 in Japan¹⁵, presenting measures to prevent heat stroke in accordance with the WBGT. The WBGT is currently used in the thermal environment assessment of international sporting events such as the Olympic Games¹⁶, and an accurate understanding of the thermal environment using WBGT measurements at each sports feld has become a fundamental element of heat countermeasures. In tennis, heat safety guidelines—such as the Extreme Weather Policy⁵ and the Japan Tennis Association (JTA)'s heat rules¹⁷—are operated based on the WBGT.

Moreover, several studies have been conducted on the diferences in the WBGT on various athletic surfaces. Pryor et al.¹¹ evaluated the WBGT for various stadiums using portable WBGT meters and reported that no diferences in the WBGT were evident for each surface but that there was considerable variation in the WBGT between surfaces and that using the WBGT published by the National Weather Service misclassifed heat safety categories for all surfaces. Grundstein et al.[10](#page-7-8) also compared the WBGT measured on grass, artifcial turf, and tennis hard courts and reported no diferences in the WBGT between surfaces, although microclimate difer-ences in dry-bulb and dew-point temperatures were evident. However, in the study by Pryor et al.^{[11](#page-7-9)}, the time of measurement was limited to the afernoon (between 13:00 and 16:30), and it was not clear from which guideline level the WBGT error at the station was created at each surface. The study by Grundstein et al.^{[10](#page-7-8)} also has several limitations. They did not make comparisons for each exercise guideline category, nor did they perform measurements on clay courts, nor did they compare the WBGT values to those at the nearest station. Consequently, based on the above problems, the investigation of the heat conditions at various tennis courts during the summer season could provide data to use as a reference for exercise guidelines and playing time on each surface. Moreover, long-term measurements for the duration of summer competitions could contribute to efective heat management for athletes, coaches, referees, and spectators. Therefore, this study aims to evaluate the heat environments of diferent tennis court surfaces using WBGT meters.

Methods

Measurement environment and the WBGT device

Natural wet-bulb and dry-bulb, and 15-mm-diameter black-bulb (AGTS-2505, Ando Keiki, Tokyo, Japan; CK-SETII-NM, Ando Keiki) WBGT meters (natural thermometers) were installed approximately 1.5 m above the surface of a blue-painted hard court (DecoTurf, Sports Surface, Tokyo, Japan), sand-flled artifcial grass court (sandgrass, Sekisui Jushi Corporation, Tokyo), and clay court (decomposed granite soil) (sofball feld) at Doshisha University in Kyotanabe, Kyoto, Japan. Measurements were taken every hour from 9:00 to 17:00 on weekdays between June 1, 2022, and September 21, 2022. The dry-bulb temperature was measured in the shade, with a temperature-sensitive area covered with aluminum foil to remove radiant heat. Ethical approval was not required for this study.

Collection of WBGT data

The dry-bulb, wet-bulb, and black-bulb temperatures were recorded, and the WBGT was calculated using the outdoor WBGT calculation formula (0.7 \times wet-bulb temperature +0.2 \times black-bulb temperature +0.1 \times dry-bulb temperature) (hard WBGT, sand-filled artificial grass WBGT, clay WBGT). The values published by public organizations are based on the Electronic Information Provision Service for Heat Index (WBGT) predictions^{[18](#page-7-16)} (provisioning service) of the Ministry of the Environment according to the observed values of the Japan Meteorological Agency (JMA). In its Application of Heat Rules and Medical Rules in Tennis Competitions in Heat publication of 2019, the JTA requires that the WBGT at the nearest point to the tournament venue be checked every hour using a provisioning service whenever the WBGT on-site measurements are not available¹⁷. Consequently, this study recorded the estimated WBGT (JMA WBGT) at the station nearest the measurement location (Kyotanabe). The JMA WBGT was calculated based on the work of Ono and Tonouchi using the following equation¹⁹:

> $JMAWBGT = 0.735 \times Ta + 0.0374 \times RH + 0.00292 \times Ta \times RH$ $+ 7.619 \times SR - 4.557 \times SR - 0.0572 \times WS - 4.064$

where *Ta* denotes the temperature (°C), *RH* denotes the relative humidity (%), *SR* denotes the total solar radiation (kW/m²), and WS denotes the average wind speed (m/s).

In the study^{[19](#page-7-17)}, the black-bulb temperature (measured using a 6-inch black-bulb thermometer), dry-bulb temperature, and wet-bulb temperature (calculated by Iribarne and Godson, 1981²⁰ using the dry-bulb temperature, dew point temperature, and ground pressure) were used to calculate the WBGT reference values. The WBGT estimation equation was calculated by multiple regression using the normally observed meteorological elements—that is, the dry-bulb temperature, relative humidity, dry-bulb temperature×relative humidity, total solar radiation, and wind speed—as explanatory variables. It should be noted that the infrared radiation is not measured in the JMA's normally observed meteorological elements, and the total solar radiation (which is the sum of direct and scattered solar radiation) is observed.

The correlation between the estimated and observed values was extremely high (r^2 =0.998), and 97.6% of the estimation error was within ± 1 °C. The quadratic terms of the total solar radiation (which showed estimation errors between the estimated and observed values) were then added as explanatory variables. The results showed that 99.8% of the estimation errors were within \pm 1 °C, 92.7% were within \pm 0.5 °C, and 33.0% were within ±0.1 °C. Te three-year data range for the six weather stations used to calculate the equation ranged from −3.9 °C

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to 38.2 °C for the temperature, 44% to 92% for temperatures below 0 °C and 28% to 52% for temperatures above 35 °C for the relative humidity.

Consequently, this formula can be used to estimate the WBGT for six cities over three years with a confdence level of 98.3–99.8% and a bias within 1.0 °C and is currently used by the JMA as the WBGT estimation formula in Japan. Global solar radiation and humidity were calculated based on values from neighboring regional meteorological stations, as 687 stations nationwide (approximately 82% of all stations in Japan), including the Kyotanabe station, do not have actual measured values. It should be noted that the use of the WBGT at the nearest station, published by a public agency for comparison with the measured WBGT has been used in a previous study^{[11](#page-7-9)} that investigated the thermal environment at various stadiums. All the measurement points on the three court surfaces were within approximately 100–200 m of each other. The distance between the tennis courts and Kyotanabe Station was approximately 3.8 km.

Statistical analysis

The hard court WBGT, sand-filled artificial grass court WBGT, clay court WBGT, and JMA WBGT were compared based on the guideline levels for heat stroke prevention ($21 \leq JMA WBGT < 25$: Caution, $25 \leq JMA$ WBGT < 28: Warning, $28 \leq$ JMA WBGT < 31: Severe Warning, $31 \leq$ WBGT: Danger) published by the JSA¹⁵. The limit values for each guideline level were determined based on an analysis of the distribution of ambient temperatures (WBGT) during the occurrence of heat stroke during exercise in Japan. The Steel-Dwass test was used to compare the WBGT and JMA WBGT for each surface. A Bland–Altman analysis was conducted for the WBGT of each surface and the JMA WBGT to confirm systematic errors²¹. Fixed errors were considered to exist in the difference between the WBGT of each surface and the JMA WBGT if the range of \pm 1.96 standard deviation from the mean (which was the limit of agreement) did not reach zero. Proportional errors were determined by regression analysis on the Bland–Altman plots, and proportional errors were considered to exist when the regression was signifcant. Hourly comparisons were made between the WBGT of each surface and the JMA WBGT using the Steel–Dwass test. R software ver. 4.2.2 and SPSS software ver. 28.0 (IBM Japan, Tokyo, Japan) were used for the statistical analyses. Statistical signifcance was set at *P*<0.05.

Human and animal rights

Ethical approval and informed consent were not required for this study as it did not involve human subjects.

Results

We collected data for 417 sets of data, excluding 322 sets of data when the WBGT meter failed, when it rained, or when the court could not use or record (WBGT meter failure: 33 sets of data, rain: 135 sets of data, the court could not use or record: 154 sets of data).

Comparison of the WBGT of each surface and the JMA WGBT

Figure [1](#page-2-0) shows a comparison of the WBGT for different court surfaces. The hard court WBGT and sand-filled artifcial grass court WBGT are signifcantly higher than the JMA WBGT (hard WBGT, median: 28.9 °C [frst quartile: 27.2 °C; third quartile: 31.3 °C]; sand-filled artificial grass WBGT, median: 28.7 °C [first quartile: 26.6 °C; third quartile: 31.5 °C]; and JMA WBGT, median: 28.2 °C [frst quartile: 26.8 °C; third quartile: 30.5 °C]; hard WBGT, p <0.01; sand-filled artificial grass WBGT, p <0.05) when all recorded data are compared.

Figure [2](#page-3-0) shows the comparative WBGT among diferent court surfaces based on JSA exercise guideline levels (guideline level)^{[15](#page-7-13)}. At the "Caution" level (21 ≤ JMA WBGT < 25), no significant differences are evident between court surfaces. At the "Warning" level ($25 \leq$ JMA WBGT < 28), the hard court WBGT is significantly higher than the JMA WBGT (hard WBGT, median: 27.8 °C [first quartile: 26.6 °C; third quartile: 28.7 °C] vs. JMA WBGT, 26.8 °C [frst quartile: 26.3 °C; third quartile: 27.4 °C]) (*p* < 0.01). At the "Severe Warning" level $(28 \leq)$ JMA WBGT < 31), the hard court WBGT and sand-filled artificial grass court WBGT are significantly higher than the JMA WBGT (hard WBGT, median: 30.1 °C [first quartile: 29.0 °C; third quartile: 31.2 °C]; sandflled artifcial grass WBGT, median: 30.0 °C [frst quartile: 28.8 °C; third quartile: 31.3 °C]; and JMA WBGT,

Figure 1. Comparative WBGT among different court surfaces (n=417).

29.6 °C [frst quartile: 28.8 °C; third quartile: 30.3 °C]; hard WBGT, *p*<0.01; sand-flled artifcial grass WBGT, *p* < 0.01). At the "Danger" level (31 ≤JMA WBGT), the WBGT of each surface is significantly higher than the JMA WBGT (hard WBGT, median: 32.5 °C [frst quartile: 31.6 °C; third quartile: 33.5 °C]; sand-flled artifcial grass WBGT, median: 32.5 °C [frst quartile: 31.8 °C; third quartile: 33.5 °C]; clay WBGT, median: 32.3 °C [frst quartile: 31.5 °C; third quartile: 32.9 °C]; and JMA WBGT, 31.7 °C [first quartile: 31.4 °C; third quartile: 32.1 °C]; hard WBGT, *p*<0.01; sand-flled artifcial grass WBGT, *p*<0.01; clay WBGT, *p*<0.01).

Figure [3](#page-4-0) shows the Bland–Altman plots for the WBGT of each surface and the JMA WBGT, revealing no fxed errors (hard WBGT, 95% CI −2.1–3.4; sand-flled artifcial grass WBGT, 95% CI −2.3–3.3; clay WBGT, 95% CI −2.4–3.0); however, proportional errors are evident (hard WBGT, B=0.057, *p*<0.01; sand-flled artifcial grass WBGT, B=0.103, *p*<0.01; clay WBGT, B=0.073, *p*<0.01).

Changes in the WBGT of each surface and JMA WBGT over time

Figure [4](#page-5-0) shows the temporal variations in the WBGT of each surface and the JMA WBGT at each guideline level. At the "Warning" level $(25 \leq)$ JMA WBGT < 28), the hard court WBGT is significantly higher than the JMA WBGT at 10:00 (median: 28.4 °C [frst quartile: 27.7 °C; third quartile: 30.0 °C] vs 26.6 °C [frst quartile: 25.9 °C; third quartile: 27.4 °C]) ($p < 0.01$). The JMA WBGT is significantly higher than the clay court WBGT at 17:00 (median: 27.0 °C [frst quartile: 26.8 °C; third quartile: 27.4 °C] vs 26.0 °C [frst quartile: 25.4 °C; third quartile: 26.7 °C]) (*p*<0.05).

At the "Severe Warning" and "Danger" levels (28≤JMA WBGT), the hard court WBGT is signifcantly higher than the JMA WBGT at 9:00 (median: 30.3 °C [frst quartile: 29.2 °C; third quartile: 31.3 °C] vs 29.4 °C [frst quartile: 28.4 °C; third quartile: 30.3 °C]), 10:00 (median: 30.9 °C [frst quartile: 29.9 °C; third quartile: 32.4 °C] vs 29.8 °C [frst quartile: 29.2 °C; third quartile: 30.6 °C]), 12:00 (median: 31.9 °C [frst quartile: 31.1 °C; third quartile: 33.0 °C vs 30.5 °C [first quartile: 29.6 °C ; third quartile: 31.5 °C]), $13:00$ (median: 31.7 °C [first quartile: 30.6 °C; third quartile: 33.0 °C] vs 30.3 °C [frst quartile: 29.5 °C; third quartile: 31.5 °C]) (9:00, *p*<0.05, 10:00, 12:00, 13:00, 17:00, *p*<0.01).

The sand-filled artificial grass court WBGT is significantly higher than the JMA WBGT at 9:00 (median: 30.5 °C [first quartile: 29.4 °C; third quartile: 31.6 °C] vs. 29.4 °C [first quartile: 28.4 °C; third quartile: 30.3 °C]), 10:00 (median: 31.1 °C [frst quartile: 29.7 °C; third quartile: 32.2 °C] vs. 29.8 °C [frst quartile: 29.2 °C; third quartile: 30.6 °C]), 12:00 (median: 31.3 °C [first quartile: 30.4 °C; third quartile: 32.1 °C] vs 30.5 °C [first quartile: 29.6 °C; third quartile: 31.5 °C]), 13:00 (median: 31.4 °C [frst quartile: 30.4 °C; third quartile: 32.9 °C] vs 30.3 °C [frst quartile: 29.5 °C; third quartile: 31.5 °C]) (9:00, 13:00, *p*<0.05, 10:00, 12:00, *p*<0.01).

The clay court WBGT is significantly higher than the JMA WBGT at 13:00 (median: 31.4 °C [first quartile: 30.2 °C; third quartile: 32.9 °C] vs (median: 30.3 °C [frst quartile: 29.5 °C; third quartile: 31.5 °C]) (*p*<0.05).

The JMA WBGT is significantly higher than the WBGT of each surface at 17:00 (hard WBGT, median: 28.2 °C) [frst quartile: 27.2 °C; third quartile: 28.8 °C]; sand-flled artifcial grass WBGT, median: 27.9 °C [frst quartile: 27.0 °C; third quartile: 28.5 °C]; clay WBGT, median: 28.1 °C [frst quartile: 27.2 °C; third quartile: 29.3 °C] vs 29.5 °C [frst quartile: 28.5 °C; third quartile: 30.4 °C]) (*p*<0.01).

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Figure 3. Bland–Altman plot of each court surface: Comparing the measured WBGT and JMA WBGT.

Discussion

In this study, more court surfaces (on-site measurements) exhibited higher values than the JMA WBGT as the WBGT increased. Hourly comparisons showed signifcantly higher values than the JMA WBGT from the morning to 13:00, mainly in hard courts and sand-flled artifcial grass courts at the "Severe Warning" and "Danger" levels (28≤JMA WBGT).

A previous study of the WBGT on diferent surfaces using a portable sensor-based WBGT meter reported that although there were no signifcant diferences between surfaces, the WBGT on black-painted tennis courts (hard courts), track and feld surfaces, red-painted track and feld surfaces, and volleyball felds (sand) were significantly higher than those measured at the nearest station^{[11](#page-7-9)}. Moreover, it has been shown that the agreement of activity guidelines between on-site measurements (at each athletic feld) and the values announced by the weather station decreased with increasing WBGT in the 26.6–32.0 $^{\circ}$ C range¹¹.

In this study, using the natural thermometer method, more court surfaces (on-site measurements) exhibited higher values than the JMA WBGT as the WBGT increased. In particular, the hard court WBGT exhibited significantly higher values than the JMA WBGT when the WBGT was > 25 °C. The Bland-Altman plot showed a proportional error between the WBGT of each surface and the JMA WBGT—that is, as the WBGT increased,

Figure 4. Changes over time in the JMA WBGT vs. hard WBGT by exercise guideline level. **p*<0.05 compared with JMA WBGT; ***p*<0.01 compared with JMA WBGT.

the JMA WBGT underestimated the heat environment of the WBGT of each tennis court surface, suggesting that actual on-court measurements are essential.

Furthermore, in this study, the heat environment in hard and sand-flled artifcial grass courts was severe based on the low guideline levels (according to the JMA WBGT) compared to clay courts. In a previous study, the WBGT at the nearest station underestimated the heat stress on the local surface when the surface was composed of synthetic materials¹¹. In this study, the hard courts and sand-filled artificial grass courts were composed of synthetic materials, and the JMA station was planted with grass to reduce heat from the ground. It could be inferred that the diference in the measurement environment (synthetic or natural materials) was a factor that caused the diference in the WBGT. Tis study's long-term evaluation of the heat environment using a WBGT meter is crucial, as heat-mitigation measures from earlier guideline levels (under conditions where the JMA WBGT is expected to reach ≥25 °C) are required in hard courts (DecoTurf), which are widely used globally. Moreover, aggressive measures are required, particularly between 9:00 and 13:00, when the amount of solar radiation is expected to increase with an increase in the solar radiation angle.

Exertional heat stroke is the second most common cause of non-traumatic death in competitive athletes 22 . Moreover, tennis (including soft tennis) is the fourth most common sport in terms of the number of heat stroke cases in elementary, junior high, high, and vocational schools, following baseball, soccer, and endurance running[23](#page-7-21). Indeed, the risk of heat stroke is high in tennis tournaments that take place in hot environments, and the Australian Open has reported an increase in the number of players calling for cooling devices and requesting doctors and trainers as the WBGT increases and several matches have been abandoned because of heat-related $illnesses²⁴$ $illnesses²⁴$ $illnesses²⁴$.

Several studies have reported that the number of heat stroke cases increased as the WBGT increased^{25[,26](#page-7-24)}. Moreover, it has been shown that the risk of heat stroke was approximately six times higher at 28–29 °C than at 25–26 °C²⁷ and that deaths due to heat stroke increased rapidly at WBGTs above 28 °C²⁸. Consequently, underestimation of the WBGT in the feld owing to JMA observations can afect the heat protection choices and activity policies of competition organizers and athletes, leading to the risk of heat stroke and poor performance. In a survey of heat measures at regional tennis tournaments in Japan, 71.6% of tournaments "prepared ice, drinking water, parasols, stretchers or wheelchairs, and automated external defbrillators," while only 49.3% of tournaments "measured the WBGT or temperature and humidity^{[29](#page-7-27)}." Given that matches may be played under severe heat conditions (especially on hard courts compared to the WBGT values at the nearest station), coaches and tournament organizers should carefully monitor the heat environment using on-site measurements of the WBGT and prepare cooling measures in advance. It is also vital to reduce the frequency of early afernoon games and proactively explore the possibility of hosting games during the early morning, evening, or nighttime. Based on the results of this study, implementing measures (in particular, the measurement and evaluation of the heat environment in the feld using WBGT meters) that consider the heat environment at each surface could prevent heat-related accidents.

This study has several limitations. Firstly, it focused solely on environmental factors contributing to heat strain without assessing the physiological load on athletes, such as water loss. Individual diferences in thermoregulation, thermal comfort, and heat strain were also not considered. Previous studies have identifed six factors infuencing heat strain: dry-bulb temperature, black-globe temperature, wind velocity, wet-bulb temperature, metabolic rate, and clothing insulation moisture permeability³⁰. A detailed analysis of environmental effects on heat stress necessitates information on four fundamental factors: air temperature, mean radiant temperature, air velocity, and absolute humidity³¹. The WBGT index provides a basic approximation of heat stress on humans. However, its limitations have been acknowledged. Budd³² pointed out that it does not adequately reflect the additional strain experienced when sweat evaporation is hindered by high humidity or low airfow. Additionally, Alfano et al[.33](#page-7-31) suggested considerations for clothing adjustments, setting limits, and adapting to changing working conditions, highlighting uncertainties in current practices. ISO7243^{[34](#page-7-32)} introduced the clothing adjustment value (CAV) and effective wet bulb globe temperature (WBGT_{eff}) to address these concerns by adjusting for clothing with different thermal properties than standard work clothing. When WBGT_{eff} exceeds the reference value, it recommends using the Predicted Heat Strain (PHS) index^{[35](#page-7-33),[36](#page-8-0)}, which integrates all six heat stress factors affecting humans³⁴. The PHS model quantitatively predicts heat burden risk by incorporating air temperature, humidity, wind speed, radiant temperature, metabolic heat production, and clothing thermal resistance into a body thermal equilibrium equation³⁴. Analysis using the PHS model demonstrated that mean radiant temperature significantly afects the Maximum Allowable Exposure Time (DLE), particularly noting a substantial decrease in DLE at high metabolic rates when the difference between mean radiant temperature and air temperature exceeds 10 $^{\circ}C^{37}$. Thus, utilizing the PHS model to quantitatively predict heat burden risk on each tennis court surface in the future could facilitate the development of more efective heat safety guidelines. Second, the model used to calculate the JMA WBGT is not internationally accepted. The ISO7243 standard (Ergonomics of the thermal environment assessment of heat stress using the WBGT (wet-bulb globe temperature) index) does not recommend indirect assessment of the WBGT¹⁴. However, in Japan, the WBGT (indirectly evaluated from meteorological data) is used to apply exercise and operational guidelines when the actual measured values at the site cannot be obtained. Consequently, we believe that it is appropriate to adopt the JMA WBGT as a comparison target for the WBGT measured at each surface, but its accuracy is not guaranteed. Third, the court used in this study was 3.8 km away from the JMA WBGT at the station, and the infuence of the surrounding environment and local climate may not have been fully considered. However, setting up an observation point adjacent to the tennis court was impossible based on JMA conditions. Fourth, this study may have underestimated the infrared radiation emitted from the ground because the WBGT was measured only at 1.5 m above ground level rather than at the three heights specified in the ISO 7243 standard¹⁴—that is, 0.1, 1.1, and 1.7 m). However, the International Olympic Committee Consensus Statement recommends that measurements be taken at 1.2–1.5 m above the ground to consider the conditions experienced by athletes¹⁶. Consequently, the data obtained in this study are considered to have some utility. Fifh, the 1 °C accuracy in the WBGT assessment used in this study is only applicable to the specifc climatic conditions for which the Japanese model was validated. Finally, there are various types of hard coating materials, and the results of this study are not comprehensive. Therefore, future measurements at multiple locations and heights and using diferent materials should be conducted to assess the impact of surfaces on the WBGT more accurately. Despite these limitations, we were able to measure the heat environment of tennis courts for approximately three months during the summer season, and our fndings point out the importance of early measurements and the need for match management that considers the court surfaces and time of day (which are the strengths of this study).

Conclusions

The WBGT was higher on many tennis court surfaces as the exercise guideline levels increased compared with the WBGT published by the JMA. Consequently, aggressive heat countermeasures should be provided for hard and sand-flled artifcial grass courts at an earlier time, as more severe heat per day was evident from 9:00 to 13:00. Tis study also demonstrated the importance of exploring the possibility of holding games in the early morning, evening, and nighttime. Lastly, these results should highlight to tournament organizers and coaches the

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importance of measuring the on-site WBGT on each court surface from an early stage. On the other hand, since WBGT serves merely as an empirical indicator for assessing heat risk, future studies should aim to quantitatively predict the magnitude of deep body temperature increase and heightened sweating on each court surface. Tis approach should also determine allowable exposure times and identify the primary thermal factors contributing to heat risk using body heat balance models such as PHS.

Data availability

The data that support the findings of this study are available from the corresponding author, [I. K.], upon reasonable request.

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Author contributions

H.Y. and K.I. contributed to the conception and design of the study. H.Y. organized the database, performed the statistical analysis, and wrote the first draft of the manuscript. T.M. and K.O. critically reviewed the statistical analysis methods. H.H., Y.Y., and K.I. interpreted the results. All authors have contributed to the manuscript and approved the submitted version.

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Additional information

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