

IDŐJÁRÁS

*Quarterly Journal of the HungaroMet Hungarian Meteorological Service
Vol. 128, No. 1, January – March, 2024, pp. 121–141*

Thermal assessments at local and micro scales during hot summer days: a case study of Belgrade (Serbia)

Stevan Savić^{1,*}, Boško Milovanović², Dragan Milošević¹, Jelena Dunjić¹,
Milica Pecelj^{2,3}, Milica Lukić⁴, Miloš Ostojić⁵, and Renata Fekete⁵

¹*University of Novi Sad, Faculty of Sciences
Chair of Geoecology, Novi Sad, Serbia*

²*Serbian Academy of Sciences and Arts,
Geographical Institute “Jovan Cvijić”, Belgrade, Serbia*

³*University of East Sarajevo, Faculty of Philosophy, Department of Geography,
East Sarajevo, Bosnia and Herzegovina*

⁴*University of Belgrade, Faculty of Geography, Belgrade, Serbia*

⁵*University of Novi Sad, Faculty of Sciences,
Department of Geography, Tourism and Hotel Management, Novi Sad, Serbia*

*Corresponding Author e-mail: stevan.savic@dgt.uns.ac.rs

(Manuscript received in final form January 11, 2023)

Abstract— Increasing thermal risk in cities is endangering the health and well-being of urban population and is driven by climate change and intensive urbanization. Therefore, if we plan to enlarge the capacities of cities to be more climate resilient in the 21st century, more detailed monitoring of urban climate on local and micro scales is needed. For this research we performed two microclimate measurement campaigns in urban area of Belgrade, during hot summer days in 2021. In total, five measurement sites were chosen in different urban designs and different local climate zones (LCZs). For thermal monitoring (air temperature – T_a and globe temperature – T_g) the Kestrel heat stress tracker sensor with 1-min measurement resolution was used, but we used 10-min average values. Obtained results showed distinct thermal differences (up to 7 °C on average) between densely built-up areas and green areas. Differences between built-up LCZs are lower with values from 2 to 4 °C. Important part of this research was microclimate monitoring on sites within the same LCZ (intra-LCZ variability). Results showed that shadows and short- and longwave radiation play a paramount role in thermal variability. Direct and reflected radiations on one measurement site increased T_a up to 6 °C and T_g up to 12 °C when compared to other measurement site (in a similar urban design), which was in the shadow.

Key-words: urban climate, temperature values, local climate zone; microclimate condition, urban design; city

1. Introduction

Numerous studies argued that different thermal conditions are driven by various urban designs, both on local scale (*Lehnert et al.*, 2021a) and microscale (*Middel and Krayenhoff*, 2019). Urban areas, characterized with predominant impervious surfaces and surface roughness, have higher thermal signal, lower evaporation, and a general disbalance in radiation and convection efficiency. Thus, urbanization directly affects temperature (air and surface), air humidity, wind speed, solar radiation, and other meteorological parameters, creating a city-specific urban climate. Furthermore, based on the modified pervious natural surfaces and the artificialization processes, thermoradiative and energetic processes are altered in cities (*Manoli et al.*, 2019). Based on the mentioned geometric/surface and thermal/radiative properties in cities, *Stewart and Oke* (2012) created a climate-based local climate zone (LCZ) classification system for urban and non-urban areas in order to standardize the research framework for thermal observations and assessments. Using LCZ concept, the heat load assessment could be performed at local scale that corresponds to areas (from hundreds of square meters to several kilometers on a horizontal scale) with uniform surface cover, urbanization structure, building materials, traffic, and human activities (*Stewart and Oke*, 2012). However, thermal differences can be uncovered on microscale, i.e., on sites that are located in the same LCZ, not only in different LCZs (*Shi et al.*, 2016; *Skarbit et al.*, 2017; *Quanz et al.*, 2018; *Shi et al.*, 2018; *Milošević et al.*, 2022a).

Climate projection outcomes displaying more frequent and severe heat waves (HWs) in Europe as a consequence of climate change (*Fischer and Schär*, 2010; *Jacob et al.*, 2018; *Geletič et al.*, 2020), and that will continue to occur during the 21st century (*Leconte et al.*, 2020; *IPCC*, 2021). According to previous publications, HWs in summer periods are generally connected with negative effects on public health in cities based on intensive outdoor thermal loads (*Tong et al.*, 2021; *Tuholske et al.*, 2021), but some results show potential positive influence of HWs in winter time in European regions that characterized with highly urbanized and populated areas/cities (*Macintyre et al.*, 2021). A combination of intense HWs and single hot days in summer and urbanization process in cities will modify urban thermal conditions more than the climate in rural/non-urbanized environments (*Oke et al.*, 2017). As a consequence, these urban-rural and intra-urban thermal differences will be intensified during intense HW periods and single hot days in summer.

The global climate change impacts force the cities to be more climate-resilient and climate-adaptable, and this task is of paramount importance (*Jänicke et al.*, 2021). Therefore, in situ and mobile measurements of climate conditions on the local and micro scales help to understand the climate processes and apply resilient/adaptable measures in cities. Previous research papers already highlighted the importance of urban networks and mobile measurements, e.g., *Konstantinov*

et al. (2018), *Dian et al.* (2019), *Šećerov et al.* (2019), *Lehnert et al.* (2021b), *Skarbit et al.* (2017), *Alonso and Renard* (2020) and *Milošević et al.* (2022a; 2022b).

Belgrade's urban heat island (UHI) and outdoor thermal comfort (OTC) indices have been identified so far in relation to the surrounding cities (*Milovanović, 2015; Milovanović et al., 2020*), or based on official meteorological station datasets (*Pecelj et al., 2021; Lukić et al., 2021*). However, this study presents the first micrometeorological measurement campaigns that were performed in Belgrade (capital of Serbia), during hot summer days in 2021, in diverse urban environments. This kind of climate monitoring can be valuable for future climate-sensitive urban design and planning strategies. Based on that, the main goals of this research are as follows: a) monitoring of micrometeorological conditions in diverse urban environments, such as densely built-up areas, industrial areas, urban or forest parks, during hot summer days; b) detailed spatial and temporal analysis of thermal conditions (air temperature – T_a and globe temperature – T_g , which is a measure of the heat stress in direct sunlight) obtained from the field measurements; and c) discussion of obtained thermal condition results in Belgrade in order to contribute to better climate change adaptation.

2. Research area, materials and methods

2.1. Description of research area

Belgrade is a capital city of the Republic of Serbia located in Southeast Europe (*Fig. 1*). City coordinates are 44°49'N and 20°27'E, with an average absolute elevation of about 117 m. The urban area of 3 222 km² has a population of about 1.6 million people. The downtown and its nearest surrounding are characterized by densely built-up urban design. Towards the suburban areas, there are more detached multi-storey buildings and one-storey houses with higher ratio of green areas. There are forest parks on the southern and northeastern parts of the urban area (*Fig. 1*). Obviously, a strongly modified climate and significant thermal differences between Belgrade urban area and its natural surroundings can be expected.

Belgrade has a *Cfa* climate (*Milovanović et al., 2017*) according to the Köppen-Geiger climate classification system (*Kottek et al., 2006*). During the 1991–2020 period, the mean annual temperature was 13.2 °C, the mean annual maximum temperature was 18.2 °C, the mean annual minimum temperature was 9.1 °C, and the mean annual precipitation is 698.9 mm (*Republic Hydrometeorological Service, 2022*).

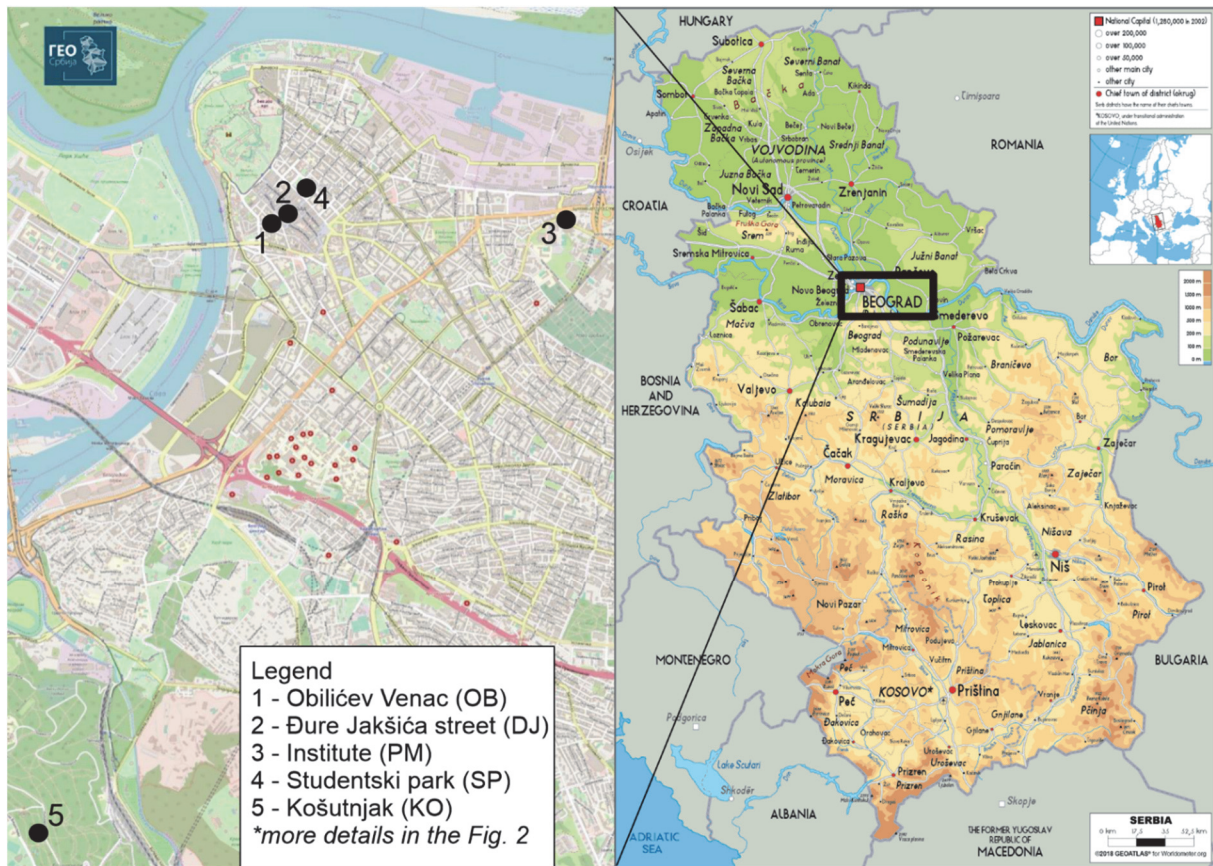


Fig. 1. Locations of micrometeorological measurement campaigns in summer 2021, and position of Belgrade in Serbia. Source of maps: <https://a3.geosrbija.rs/> (urban map of Belgrade) and https://www.worldometers.info/img/maps/serbia_physical_map.gif (Serbia/Europe).

2.2. Measurement locations and datasets

Micrometeorological monitoring has been performed through organization of two measurement campaigns in the urban area of Belgrade. Measurement campaigns were performed on June 18 and August 23, 2021 on five locations with different urban environments (Fig. 2). Both measurement campaigns were realized on hot summer days, i.e., during intensive HW periods. The HW period is defined as period with minimum three consecutive days with maximum temperature $5\text{ }^{\circ}\text{C}$ or more comparing to average for this part of the year. In our case, in Belgrade, the average T_a is $22.0\text{ }^{\circ}\text{C}$ in June and $24.0\text{ }^{\circ}\text{C}$ in August (Republic Hydrometeorological Service, 2022), so days with maximum temperature of $29\text{ }^{\circ}\text{C}$ or higher can be considered as adequate. Selected hot summer days, for our research, were characterized with maximum daily air temperature higher than $30\text{ }^{\circ}\text{C}$, no precipitation, low cloud cover, low wind speed, and intense solar radiation. Measurement campaigns were conducted at five sites with different urban designs: 1) Obilićev Venac (OV) is characterized by an open square with combination of pavement and green area with trees, and surrounded by densely built-up area that is equivalent to LCZ 2

according to *Stewart and Oke* (2012) classification system of local climate zones (LCZs). This location is a popular pedestrian and relaxation area in the city; 2) Đure Jakšića street (DJ) is an urban canyon street with multi-storey buildings on both sides and without green areas. The street is 100% covered by artificial surfaces and oriented northeast-southwest. This location is part of LCZ 2 and is a very intensive pedestrian corridor; 3) Institute for Biological Research „Siniša Stanković” (PM) is characterized by the combination of parking lots and green areas (on microlevel) and surrounded by light industrial buildings and residential areas. This measurement location is a synergy between LCZ 8 and LCZ 3; 4) Studentski park (SP) is characterized by an urban park with scattered trees (LCZ B). This park is about 200 m long and with width of about 100 m (based on Google Earth data). The central part of the park is an open square, while other parts of the park are a combination of green areas with trees and pedestrian footpaths. This park is surrounded by densely built-up areas that represent LCZ 2; and 5) Košutnjak (KO) presents a forest park in the suburban area with dense trees (LCZ A), and this location is characterized by 100% of pervious surfaces and green areas. Locations SP and KO are popular relaxation areas. Locations of measurement sites are presented in *Fig. 1* and *Fig. 2*, and more microenvironmental characteristics of each site are shown in *Table 1*.

Table 1. Basic descriptions of the microenvironment around the five measurement locations

Date of measurement	Name of location	Abbreviation of location	Latitude (N) longitude (E)	Altitude (m)	Urban area feature	LCZ
June 18 /August 23, 2021	Obilićev Venac	OV	44°48'59"; 20°27'18"	113	downtown; densely built	2
August 23, 2021	Đure Jakšića street	DJ	44°49'02"; 20°27'23"	116	downtown; densely built	2
June 18, 2021	Institute for Biological Research „Siniša Stanković”	PM	44°49'03"; 20°29'12"	94	industrial; residential	8 ₃
August 23, 2021	Studentski park	SP	44°49'09"; 20°27'29"	111	downtown; urban park	B
June 18, 2021	Košutnjak	KO	44°46'10"; 20°25'43"	220	outskirt; forest park	A

LCZ – local climate zone classification (based on *Stewart and Oke*, 2012)



Fig. 2. Locations of micrometeorological measurements (performed on June 18 and August 23, 2021) in Belgrade (Serbia): (1) Obilićev Venac – OV; (2) Đure Jakšića street – DJ; (3) Institute for Biological Research „Siniša Stanković” – PM; (4) Studentski park – SP; and (5) Košutnjak - KO.

Measurement campaign on June 18 was performed from 12:00 to 18:00 in Central European Summer Time – CEST at three locations (OV, PM, and KO). On August 23, the measurements were conducted from 12:00 to 21:00 (CEST) at OV, DJ, and SP. The goal was to monitor thermal differences in various urban designs during the hottest parts of the day and during the sunset period, when the highest thermal differences are expected in different urbanization types.

Three Kestrel 5400 Heat Stress Tracker sensors (*Fig. 2, Table 2*) were used to obtain one-minute measurements of T_a – air temperature measured at 1.1 m from the surface (in °C) and T_g – globe temperature measured at 1.1 m from the surface (in °C), during both measurement campaigns. The T_g is referred as the globe temperature or black globe temperature and resembles the thermal values of surroundings, and that means that T_g simulates the thermal conditions felt by the human body (*available at: https://www.designingbuildings.co.uk/wiki/Globe_temperature*). For further statistical analysis, we used 10-minute average values of the measured variables. Usage of 10-minute average values of meteorological variables showed to be sufficiently frequent for this kind of urban thermal analysis (*Unger et al., 2018; Milošević et al., 2022a; 2022b*). The Kestrel Heat Stress Tracker sensors were deployed at least 15 minutes before the start of the measurement in order to allow the sensors to equilibrate to the atmospheric conditions. Furthermore, the equipment is calibrated in accordance with the manufacturer’s specifications (*available at: <https://kestrelinstruments.com/mwdownloads/download/link/id/14/>*).

Table 2. Accuracy, resolution, and range of Kestrel 5400 Heat Stress Tracker sensors used for outdoor thermal condition measurements in Belgrade (Serbia)

Sensors	Accuracy (+/-)	Resolution	Range
Air temperature (T_a)	0.5 °C	0.1 °C	-29.0 to 70.0 °C
Relative humidity (RH)	±2%RH	0.1%RH	10 to 90% 25 °C non-condensing
Wind speed (v)	larger of 3% of reading, least significant digit or 0.1 m/s	0.1 m/s	0.6 to 40.0 m/s
Globe temperature (T_g)	1.4 °C	0.1 °C	-29.0 to 60.0 °C

Note: available at: <https://kestrelinstruments.com/mwdownloads/download/link/id/14/>

2.3. Statistical methods

The description of the measured data is given using central tendency and dispersion (mean value, standard deviation, absolute maximum, and absolute minimum values of T_a and T_g – *Table 3*). Daily fluctuations of measured variables

in the period from 12:00 to 18:00 CEST and 12:00 to 21:00 CEST is shown graphically (*Fig. 3* and *Fig. 4*). We defined our research question as: Is there any significant difference between Ta/Tg values measured at different locations in Belgrade during the hot summer days? To test the null hypothesis H_0 – there is no statistically significant difference between the Ta values measured at the mentioned locations; and H_0 – there is no statistically significant difference between the Tg values measured at the mentioned locations; the one-way analysis of variance was used. Finally, following the results of the Levene test of homogeneity of variances, Hochberg and Games-Howell post-hoc tests were used to compare the values of the measured variables between possible pairs of locations. Those tests are considered appropriate if some of the assumptions for the application of one-way analysis of variance are not appropriate (*Tamhane, 1979; Stoline, 1981; Shingala and Rajyaguru, 2015*). To conduct the mentioned analysis, we used SPSS v. 14.

Table 3. Main statistical characteristics of air temperature (Ta) and globe temperature (Tg) in diverse urban environments of Belgrade (Serbia) during the measurement campaigns

Date of measurement	Locations	Ta (°C)				Tg (°C)			
		max.	min.	aver.	st. dev.	max.	min.	aver.	st. dev.
June 18, 2021	OV	34.7	26.8	30.8	1.9	48.5	35.4	42.5	3.3
	PM	36.1	29.6	32.6	1.7	50.3	34.1	42.6	3.8
	KO	29.4	25.8	27.8	0.9	37.6	26.9	29.5	1.3
August 23, 2021	OV	36.5	23.5	31.0	3.7	47.5	23.2	35.7	8.6
	DJ	40.6	25.4	32.1	3.8	49.1	25.6	34.1	6.9
	SP	33.4	23.6	30.3	3.1	39.1	23.7	31.6	4.0

max. – maximum; min. – minimum; aver. – average; st. dev. – standard deviation.

3. Results

3.1. Temperature measurements

During the two days measurement campaigns, the highest Ta values were recorded in the most densely built-up areas (OV, PM, DJ) and the lowest values were measured in green areas (KO and SP) (*Table 3*). The highest average Ta and $Tmax$ values were measured in the compact mid-rise zone – LCZ 2 (OV, DJ) and large low-rise zone with small area and houses – LCZ 8₃ (PM). $Tmax$ ranged from

34.7 °C (OV on June 18) to 40.6 °C (DJ on August 23). In the dense trees zone – LCZ A (KO – forest park) and scattered trees zone – LCZ B (SP – urban park), T_{max} values are about 7 °C lower compared to the densely built-up zones (LCZ 2/LCZ 8₃). Similar tendencies are visible in the averaged T_a values, but with a smaller temperature difference (about 2 °C to 5 °C) between various LCZ types. Contrary to average T_a and T_{max} , T_{min} values are quite similar at all measurement locations, except the location PM. The T_{min} is about 2 °C higher in PM in both measurement days, which can be explain with very intensive traffic in the morning in the industrial surroundings. The values of the standard deviation show 50% lower value at the location of KO (forest park) in relation to OV and PM (in June 18) and about 20% lower value at the location of SP (urban park) in relation to OV and DJ (in August 23) (*Table 3*).

Fig. 3 shows 10-minute T_a differences between measurement locations and provide detailed insights into the temporal variability of T_a in different urban designs in Belgrade. During the whole period of measurement (from 12:00 to 18:00, on June 18 CEST), T_a differences are positive when comparing densely built-up areas (OV and PM) with green area (KO). The highest intra-urban differences were recorded at 16:30 (8.7 °C) between PM and KO, and at 18:00 (7.1 °C) between OV and KO. Generally, the differences between OV/PM and KO constantly increased from 16:30 towards 18:00, but quite high differences can be also noticed before 15:30. The intra-urban comparison between LCZ 2 (OV) and LCZ 8₃ (PM) show lower T_a values on OV location during most of the time, with a few exceptions (*Fig. 3a*).

Temporal variability based on 10-minute T_a values during the measurement campaign on August 23 (from 12:00 to 21:00 CEST) present constantly higher values in the densely built-up area (LCZ 2) with locations OV and DJ, when compared to the urban park (SP). Only during the sunset and nighttime, the differences between OV and SP are negligible. The highest intra-urban differences are measured between DJ and SP, with differences higher than 7 °C (form 14:20 to 15:20), and OV-SP with the highest difference of 4.6 °C (at 12:30). The micro-location differences within the LCZ 2 zone (OV-DJ) show higher T_a values at OV location from 12:00 to 14:00, but during the rest of the measurement time, DJ location was warmer, particularly from 14:00 to 16:00 CEST (*Fig. 3b*).

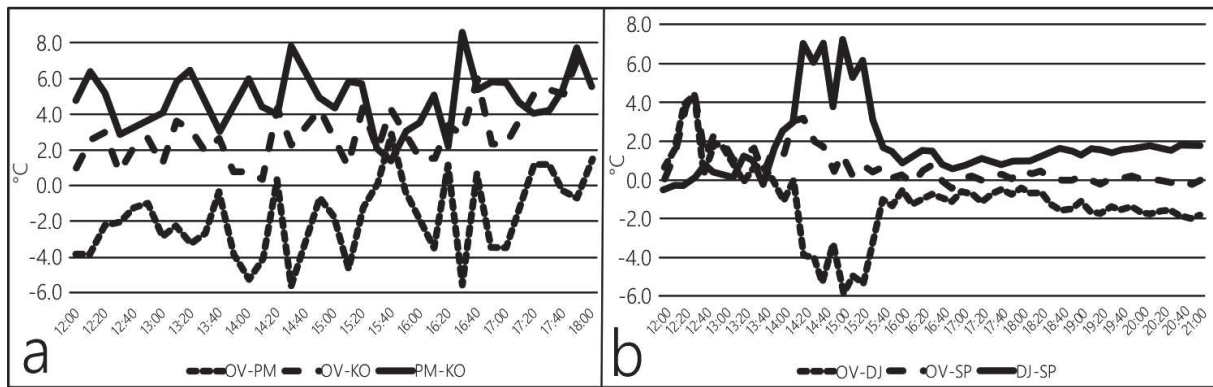


Fig. 3. Temporal variation of T_a in Belgrade (Serbia) during the measuring campaigns: (a) on June 18 – measurement time 12:00-18:00 CEST; and (b) August 23 – measuring time 12:00-21:00 CEST). The OV-PM – represents T_a differences between the diverse densely built-up types (LCZ 2/LCZ 8₃); OV-KO – represents T_a differences between the densely built-up type (LCZ 2) and forest park (LCZ A); and PM-KO – represents T_a differences between the densely built-up type (LCZ 8₃) and forest park (LCZ A).

The highest values of T_g , during both measurement campaigns are recorded at densely built-up zones (OV, PM, DJ), and the lowest values are noticed in forest and urban parks (KO and SP). The differences between built-up zones (OV, PM, DJ) and green areas (KO, SP) are from about 10 °C to 13 °C – T_{gmax} , about 2 °C to 9 °C – T_{gmin} , and about 4 °C to 13 °C – average T_g . The highest differences are recorded between densely built-up zones (LCZ 2/LCZ 8₃) and forest park (LCZ A) during the measurement campaign on June 18. Contrarily to that, significantly smaller differences were observed between compact mid-rise built-up zone (LCZ 2) and urban park (LCZ B) during the measurement campaign on August 23. The values of the standard deviation are three times lower in the forest park (KO), i.e., twice lower in the urban park (SP) compared to the urbanized parts of the city (Table 3).

Temporal variations of T_g (Fig. 4), during the measurement campaign on June 18 (Fig. 4a) show positive differences between OV/PM and KO during the whole measurement time, with a substantially hotter period between 14:00 and 15:30 CEST. During that time, T_g is higher from 12 °C to 17 °C in densely urbanized zones compared to the green area of forest park. Furthermore, T_g values are higher in large low-rise zone with small area of houses – LCZ 8₃ (PM) then in compact mid-rise zone – LCZ 2 (OV) during most of the measurement time (between 12:00 and 18:00). Only during a few short periods, T_g values are higher at OV location.

Fig. 4b presents T_g intra-urban differences during the measurement campaign on August 23 (from 12:00 to 21:00 CEST). On all three micro-locations (OV, DJ, and SP), after 16:00 CEST, T_g differences are around 0 °C (2 °C or less). On the other hand, significant differences between the densely built-up zone (OV

and DJ) and urban park (SP) are recorded from 12:00 to 16:00, particularly in the period from 14:00 to 16:00. In these hours, locations in LCZ 2 are substantially hotter than the urban park with T_g differences up to 15 °C. Also, the interesting outcome is that DJ location has substantially higher T_g values compared to OV location in the period from 14:00 to 15:40. In the period between 12:00 and 14:00, OV location has noticeable higher T_g values compared to DJ location. In both cases, T_g differences are up to 12 °C.

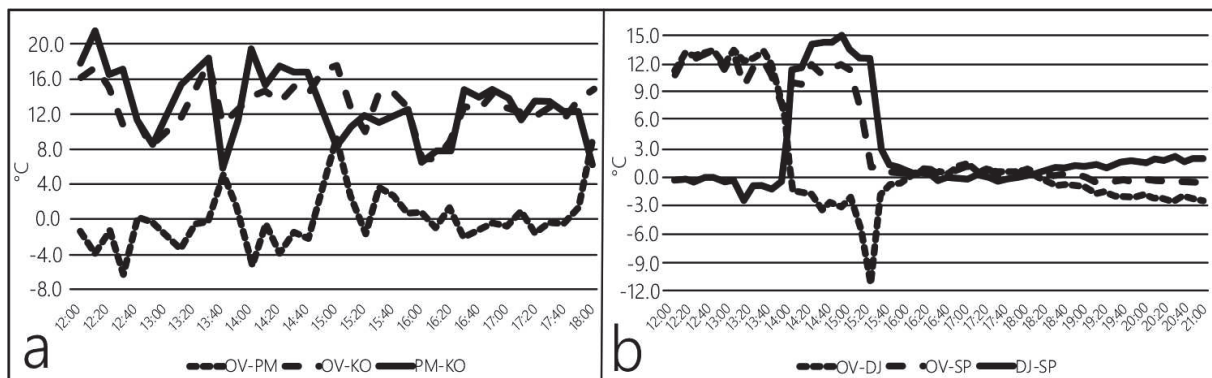


Fig. 4. Temporal variation of T_g in Belgrade (Serbia) during the measuring campaigns: (a) on June 18 – measurement time 12:00-18:00 CEST; and (b) on August 23 – measurement time 12:00-21:00 CEST). OV-DJ – represents T_g differences within the same densely built-up type (LCZ 2); OV-SP – represents T_g differences between the densely built-up type (LCZ 2) and urban park (LCZ B); and DJ-SP – represents T_g differences between the densely built-up type (LCZ 2) and urban park (LCZ B).

3.2. Statistical outcomes

To examine whether there is a statistically significant difference between T_a and T_g on all three locations during the measurement campaign on June 18, a one-way analysis of variance was applied. It was shown that there are statistically significant differences ($\alpha = 0.05$) in T_a (Table 4) and T_g (Table 5) between the measurement locations.

Table 4. Results of the one-way analysis of T_a variance during the measurement campaign on June 18 (measurement time 12:00–18:00 CEST)

	Sum of squares	df	Mean square	F	Sig.
Between groups	432.486	2	216.243	88.210	0.000
Within groups	264.757	108	2.451		
Total	697.243	110			

df – degree of freedom; F – F-value; Sig. - significance

Table 5. Results of the one-way analysis of T_g variance during the measurement campaign on June 18 (measurement time 12:00–18:00 CEST)

	Sum of squares	df	Mean square	F	Sig.
Between groups	4039.694	2	2019.847	209.242	0.000
Within groups	1042.541	108	9.653		
Total	5082.234	110			

df – degree of freedom; F – F-value; Sig. - significance

Hochberg and Games-Howell post-hoc tests were used to determine which pairs of measurement locations had a statistically significant differences in T_a and T_g , respectively. These tests were chosen because the Levene test showed that there was no homogeneity of variance in the analyzed variables (Table 6 and Table 7).

Table 6. Results of the Levene test of homogeneity of variance for T_a measured during the measurement campaign on June 18 (measurement time 12:00–18:00 CEST)

Levene statistic	df1	df2	Sig.
8.139	2	108	0.001

df1 and df2 – degrees of freedom; Sig. - significance

Table 7. Results of the Levene test of homogeneity of variance for T_g measured during the measurement campaign on June 18 (measurement time 12:00–18:00 CEST)

Levene statistic	df1	df2	Sig.
6.772	2	108	0.002

df1 and df2 – degrees of freedom; Sig. - significance

Regarding T_a , both tests showed that there are statistically significant differences between each of the pairs of locations (KO-OV; KO-PM, OV-PM), i.e., that T_a in KO is significantly lower than that in PM, i.e., OV, and that T_a on OV is significantly lower than that in PM (Table 8). In terms of T_g , there is a statistically significant difference only between KO and OV, i.e., KO and PM, where T_g value in KO is lower by about 12.8 °C than at PM and OV. The difference in T_g between PM and OV is negligible (0.027 °C) and not statistically significant (Table 9).

Table 8. Results of post-hoc tests for T_a measured during the measurement campaign on June 18 (measurement time 12:00–18:00 CEST)

Post-hoc test	Location	Location	Mean difference (°C)	Std. error	Significance
Hochberg	KO	PM	-4.784	0.36402	0.000
		OV	-3.000	0.36402	0.000
	PM	KO	4.784	0.36402	0.000
		OV	1.784	0.36402	0.000
Games-Howell	KO	PM	-4.784	0.319217	0.000
		OV	-3.000	0.344469	0.000
	PM	OV	1.784	0.420683	0.000

Significance values marked with grey areas are statistically significant.

Table 9. Results of post-hoc tests for T_g measured during the measurement campaign on June 18th (measurement time 12:00–18:00 h CEST)

Post-hoc test	Location	Location	Mean difference (°C)	Std. error	Significance
Hochberg	KO	PM	-12.784	0.698	0.000
		OV	-12.811	0.629	0.000
	PM	KO	12.784	0.698	0.000
		OV	-0.027	0.826	0.999
Games-Howell	KO	PM	-12.784	0.698	0.000
		OV	-12.811	0.629	0.000
	PM	OV	-0.027	0.826	0.999

Significance values marked with grey areas are statistically significant.

Analysis of variance for the measurement campaign on August 23 showed that there is a statistically significant difference in T_a and T_g between the measurement locations, i.e., OV, SP, and DJ (Tables 10 and 11). Furthermore, Levene test showed that there is a homogeneity of variance in T_a , while it is absent for T_g (Tables 12 and 13).

Table 10. Results of one-way analysis of T_a variance during the measurement campaign on August 23 (measurement time 12:00–21:00 CEST)

	Sum of squares	df	Mean square	F	Sig.
Between groups	90.703	2	45.352	3.570	0.030
Within groups	2058.109	162	12.704		
Total	2148.812	164			

df – degree of freedom; F – F-value; Sig. - significance

Table 11. Results of one-way analysis of T_g variance during the measurement campaign on August 23 (measurement time 12:00–21:00 CEST)

	Sum of squares	df	Mean square	F	Sig.
Between groups	514.521	2	257.261	5.627	0.004
Within groups	7406.473	162	45.719		
Total	7920.994	164			

df – degree of freedom; F – F-value; Sig. - significance

Table 12. Results of the Levene test of homogeneity of variance for T_a measured during the measurement campaign on August 23 (measurement time 12:00–21:00 CEST)

Levene Statistic	df1	df2	Sig.
0.523	2	162	0.594

df1 and df2 – degrees of freedom; Sig. - significance

Table 13. Results of the Levene test of homogeneity of variance for T_g measured during the measurement campaign on August 23 (measurement time 12:00–21:00 CEST)

Levene Statistic	df1	df2	Sig.
17.014	2	162	0.000

df1 and df2 – degrees of freedom; Sig. - significance

A statistically significant difference in T_a (1.8 °C) exists only between DJ and SP (Table 14). According to the Hochberg post-hoc test, a statistically significant difference in T_g exists only between OV and SP. However, according to the Games-Howell post-hoc test, there is a statistically significant difference between OV and SP, but also between DJ and SP (Table 15).

Table 14. Results of post-hoc tests for T_a measured during the measurement campaign on August 23 (measurement time 12:00–21:00 CEST)

Post-hoc test	Location	Location	Mean difference (°C)	Std. error	Significance
Hochberg	OV	DJ	-1.109	0.680	0.281
		SP	0.691	0.680	0.671
	DJ	OV	1.109	0.680	0.281
		SP	1.800	0.680	0.026
Games-Howell	OV	DJ	-1.109	0.720	0.276
		SP	0.691	0.650	0.539
	DJ	OV	1.109	0.720	0.276
		SP	1.800	0.667	0.022

Significance values marked with grey areas are statistically significant.

Table 15. Results of post-hoc tests for T_g measured during the measurement campaign on August 23 (measurement time 12:00–21:00 CEST)

Post-hoc test	Location	Location	Mean difference (°C)	Std. error	Significance
Hochberg	OV	DJ	1.673	1.289	0.480
		SP	4.291	1.289	0.003
	DJ	OV	-1.673	1.289	0.480
		SP	2.618	1.289	0.126
Games-Howell	OV	DJ	1.673	1.483	0.499
		SP	4.291	1.280	0.004
	DJ	OV	-1.673	1.483	0.499
		SP	2.618	1.072	0.043

Significance values marked with grey areas are statistically significant.

4. Discussion and conclusions

Micrometeorological measurement campaigns performed in Belgrade during hot summer days confirmed general statement that different urban designs have specific thermal patterns. The obtained results showed that densely built-up areas with multi-storey buildings (OV and DJ locations), densely built-up areas with light industrial buildings and residential areas (PM location), and green areas with trees (SP and KO locations) have different thermal conditions during the day/evening/sunset hours, and in the most cases, these differences are statistically

significant, as it was presented in results. Therefore, it can be concluded that the LCZ classification system created by *Stewart and Oke* (2012) based on different built-up and land cover types is appropriate method for thermal difference assessments in cities on the local scale.

Results from this study showed that temperature differences between densely built-up areas and green areas are about 7 °C, while differences between various built-up zones (LCZ 2 – LCZ 8₃) are about 2–4 °C. Previous studies focused on *T_a* showed that the highest *T_a* values are usually found in more urbanized areas of the city. For example, in Lisbon (Portugal), the more compact urban areas had the highest temperature conditions (*Oliveira et al.*, 2021), and in Banja Luka (Bosnia & Herzegovina), the downtown area with densely built-up design had highest thermal conditions in daytime and nighttime hours during the hot summer days (within HW period), when compared to urban park and riverside (*Milošević et al.*, 2022a). Research studies also analyzed urban shadows and green areas as elements that drive thermal conditions. *Lelovics et al.* (2016) recognized urban cool island with temperature lower by 1 °C (in Szeged, Hungary) or 2 °C (in Novi Sad, Serbia) in densely built-up zones during the summer days caused by shadowing conditions. Furthermore, urban parks that are close to/or within downtown areas could lower temperature conditions with up to 1 °C or more, that is noticed in Ghent (Belgium) (*Top et al.*, 2020). Therefore, a few research studies related of green infrastructures and its cooling potential in cities are published already. *Tan et al.* (2016; 2017) highlighted the impact of trees in Sky View Factor values, and some authors (*Morakinyo et al.*, 2020; *Gál et al.*, 2021) pronounced different spatial characteristics of green areas and content of species as elements that driving to cooler thermal conditions in hot periods. Also, we can conclude that hot summer days that occur within the heat wave periods represent higher concern based on general accumulation of heat during the consecutive hot summer days and obtained intensive outdoor thermal load (surplus of the heat) in built-up areas, as well as in rural/non-urbanized areas.

Our research also showed temperature differences between the locations in the same LCZ (OV and DJ locations), i.e., these outcomes emphasize that urban areas are characterized by specific thermal conditions on the microscale. OV and DJ locations are only 150 m away from each other, both are in the LCZ 2, but OV site is the open square with pavement and green area, while DJ is in a narrow street canyon with no green area (*Fig. 2*). During the measurement day, the OV site was sunny, while street canyon was in the shade from 12:00 to 14:00 CEST, which lead to higher *T_a* (about 4 °C) and *T_g* values (about 12 °C) on the OV site. Completely different thermal conditions at these two locations occur from 14:00 to 15.30 CEST. During this time, DJ site is entirely sunny, and the OV location is mostly in shadows because of trees and high buildings on the south part of the square. In this one and a half hour, the maximum measured *T_a* difference (DJ-OV) is 6 °C, and the maximum measured *T_g* difference is 12 °C. After 15.30 until the end of the measurement, both sites are in shadow, and differences are from

0 °C to 2–3 °C. These outcomes are in general in accordance with the results of *Geletič et al.* (2021), where is pronounced that direct and reflected radiation intensified thermal conditions in urban surroundings. On the other hand, we have to be aware of technical issues in Kestrel Heat Stress Trackers i.e., when the black globe is under direct radiation, this could lead to overestimation of T_g values (*Kántor and Unger, 2011; Middel et al., 2016*). Intra-LCZ variability was analyzed by others, too, and *Skarbit et al.* (2017) found small differences (less than 1 °C) in Szeged (Hungary) between sites in LCZ 5, 6 and 9. *Shi et al.* (2018) confirmed thermal differences from LCZ 1 to LCZ 6 in Hong Kong, and the range is from 2 °C to 3 °C. *Quanz et al.* (2018) analyzed thermal conditions within LCZ 2_B and found that average daily differences are generally about 1 °C, but during clear, calm, and dry days, the daytime differences are rising about 3 °C.

During the same campaign in August, the results show that there are no differences of more than 3 °C between the OV/DJ locations and the SP site (urban park) in the period after 15:00 CEST. All three sites are in the shade after 15:00 CEST, but due to the green area in the urban park, lower values are expected. However, this is not the case, which may be due to several factors, such as the size of the park, which is approximately 100×200 m, characterized by scattered trees and urban environment around the park that is densely built-up (LCZ 2). Such a statement is in accordance with other studies that highlighted spatial characteristics of green areas as thermal conditions regulator (*Morakinyo et al., 2020; Gál et al., 2021*).

Finally, to prepare cities to be more resilient to climate change and heat risks, detailed thermal conditions monitoring on the microscale is needed, and therefore, further thermal assessments could be based on crowd-sourcing techniques using citizen weather stations (CWS), smart-phone records, web-based tools (*Fenner et al., 2017, 2019; Venter et al., 2020*), or purpose-designed mobile/portable instruments with specifically-numbered and high-accuracy sensors, particularly for radiation measurements (*Middel and Krayenhoff, 2019; Schnell et al., 2021*). These kind of monitoring can contribute to achieving the SDGs (Sustainable Development Goals) within the Agenda 2030 through: a) raise awareness of heat load stress and to improve the public health care for vulnerable groups (under age or poverty groups) of the population in cities (SDG 3); b) contribute to a better implementation of climate-conscious urbanization that can improve the microclimate conditions, increase quality of life of the population, and adapt cities to climate change (SDG 11); and c) contribute to further adaptation to climate change, especially in urban areas where the microclimate and local climate are additionally modified due to the impact of urbanization (SDG 13). Obviously, the interaction of the process of "climate change-urbanization-urban climate" and its direct impact on the tendencies of atmospheric changes in cities should be incorporated into the development of climate action policies, as it becomes a serious issue in the twenty-first century (*Savić et al., 2022*).

The potential shortcoming of this research can be defined in the number of days when measurements were taken, considering that during the summer of 2021, there were significantly more hot days. However, the two hot summer days that were analyzed in this study may well represent a realistic picture of the micro-scale thermal conditions in Belgrade, and each one must take into account both technical and human capacities when planning field measurements. The further development of these investigations will develop both on temporal and spatial levels, and it will be particularly interesting to implement a campaign of measurements in different urban micro conditions during tropical nights and to monitor the differences in thermal conditions.

Acknowledgements: This research was supported by the financial support of the Ministry of Education, Science and Technological Development of the Republic of Serbia (Grant No. 451-03-47/2023-01/200125). We would like to thank the Institute for Biological Research “Siniša Stanković” for the location provided for field measurements.

References

- Alonso, L. and Renard, F., 2020: A new approach for understanding urban microclimate by integrating complementary predictors at different scales in regression and machine learning models. *Remote Sens-Basel* 12(15), 2434. <https://doi.org/10.3390/rs12152434>
- Dian, C., Pongrácz, R., Incze, D., Bartholy, J., and Talamon, A., 2019: Analysis of the urban heat island intensity based on air temperature measurements in a renovated part of Budapest (Hungary). *Geographica Pannonica* 23, 277–288. <https://doi.org/10.5937/gp23-23839>
- Fenner, D., Meier, F., Bechtel, B., Otto, M., and Scherer, D., 2017: Intra and inter ‘local climate zone’ variability of air temperature as observed by crowdsourced citizen weather stations in Berlin, Germany. *Meteorol. Z.* 26, 525–547. doi: 10.1127/metz/2017/0861
- Fenner, D., Holtmann, A., Meier, F., Langer, I., and Scherer, D., 2019: Contrasting changes of urban heat island intensity during hot weather episodes. *Environ. Res. Lett.* 14, 124013. <https://doi.org/10.1088/1748-9326/ab506b>
- Fischer, E.M. and Schär, C., 2010: Consistent geographical patterns of changes in high-impact European heatwaves. *Nat. Geosci.* 3, 398–403. <https://doi.org/10.1038/ngeo866>
- Gál, T., Mahó, S. I., Skarbit, N., and Unger, J., 2021: Numerical modelling for analysis of the effect of different urban green spaces on urban heat load patterns in the present and in the future. *Comput. Environ. Urban* 87, 101600. <https://doi.org/10.1016/j.compenurbsys.2021.101600>
- Geletič, J., Lehnert, M., and Jurek, M., 2020: Spatiotemporal variability of air temperature during a heat wave in real and modified landcover conditions: Prague and Brno (Czech Republic). *Urban Clim.* 31, 100588. <https://doi.org/10.1016/j.uclim.2020.100588>
- Geletič, J., Lehnert, M., Krč, P., Resler, J., and Krayenhoff, E.S., 2021: High-resolution modelling of thermal exposure during a hot spell: a case study using PALM-4U in Prague, Czech Republic. *Atmosphere-Basel* 12(2), 175. <https://doi.org/10.3390/atmos12020175>
- IPCC, 2021: Summary for Policymakers. In: *Climate Change 2021: The Physical Science Basis. Contribution of Working Group I to the Sixth Assessment Report of the Intergovernmental Panel on Climate Change* [Masson-Delmotte V, P Zhai, A Pirani, SL Connors, C Péan, S Berger, N Caud, Y Chen, L Goldfarb, MI Gomis, M Huang, K Leitzell, E Lonnoy, JBR Matthews, TK Maycock, T Waterfield, O Yelekçi, R Yu, B Zhou (eds.)]. Cambridge University Press, Cambridge, United Kingdom and New York, NY, USA, 3–32. <https://doi.org/10.1017/9781009157896.001>

- Jacob, D., Kotova, L., Teichmann, C., Sobolowski, S.P., Vautard, R., Donnelly, C., Koutroulis, A.G., Grillakis, M.G., Tsanis, I.K., Damm, A., and Sakalli, A., 2018: Climate impacts in Europe under +1.5 C global warming. *Earths Future* 6, 264–285. <https://doi.org/10.1002/2017EF000710>
- Jänicke, B., Milošević, D., and Manavvi, S., 2021: Review of User-Friendly Models to Improve the Urban Micro-Climate. *Atmosphere-Basel* 12(10), 1291. <https://doi.org/10.3390/atmos12101291>
- Kántor, N. and Unger, J., 2011: The most problematic variable in the course of human-biometeorological comfort assessment—the mean radiant temperature. *Cent. Eur. J. Geosci.* 3, 90–100. <https://doi.org/10.2478/s13533-011-0010-x>
- Konstantinov, P., Varentsov, M., and Esau, I., 2018: A high density urban temperature network deployed in several cities of Eurasian Arctic. *Environ. Res. Lett.* 13(7), 075007. <https://doi.org/10.1088/1748-9326/aacb84>
- Kottek, M., Grieser, J., Beck, C., Rudolf, B., and Rubel, F., 2006: World Map of the Köppen-Geiger climate classification updated, *Meteorol. Z.* 15(3), 259–263. <https://doi.org/10.1127/0941-2948/2006/0130>
- Leconte, F., Bouyer, J., and Claverie, R., 2020: Nocturnal cooling in Local Climate Zone: Statistical approach using mobile measurements. *Urban Clim.* 33, 100629. <https://doi.org/10.1016/j.uclim.2020.100629>
- Lehnert, M., Savić, S., Milošević, D., Dunjić, J., and Geletič, J., 2021a: Mapping local climate zones and their applications in European urban environments: A systematic literature review and future development trends. *ISPRS Int. J. Geo-Inf.* 10, 260. <https://doi.org/10.3390/ijgi10040260>
- Lehnert, M., Brabec, M., Jurek, M., Tokar, V., and Geletič, J., 2021b: The role of blue and green infrastructure in thermal sensation in public urban areas: A case study of summer days in four Czech cities. *Sustain. Cities Soc.* 66, 102683. <https://doi.org/10.1016/j.scs.2020.102683>
- Lelovics, E., Unger, J., Savić, S., Gál, T.M., Milošević, D., Gulyás, Á., Marković, V., Arsenović, D., and Gál, C.V., 2016: Intra-urban temperature observations in two Central European cities: a summer study. *Időjárás* 120, 283–300.
- Lukić M., Filipović, D., Pecelj, M., Crnogorac, L., Lukić, B., Divjak, L., Lukić, A., and Vučićević, A., 2021: Assessment of Outdoor Thermal Comfort in Serbia's Urban Environments during Different Seasons. *Atmosphere-Basel* 12(8), 1084. <https://doi.org/10.3390/atmos12081084>
- Manoli, G., Fatichi, S., Schlöpfer, M., Yu, K., Crowther, T.W., Meili, N., Burlando, P., Katul, G.G., and Bou-Zeid, E., 2019: Magnitude of urban heat islands largely explained by climate and population. *Nature* 573, 55–60. <https://doi.org/10.1038/s41586-019-1512-9>
- Macintyre, H.L., Heaviside, C., Cai, X., and Phalkey, R., 2021: The winter urban heat island: Impacts on cold-related mortality in a highly urbanized European region for present and future climate. *Environ. Int.* 154, 106530. <https://doi.org/10.1016/j.envint.2021.106530>
- Middel, A., Selover, N., Hagen, B., and Chhetri, N., 2016: Impact of shade on outdoor thermal comfort—a seasonal field study in Tempe, Arizona. *Int. J. Biometeorol.* 60(1), 1849–1861. <https://doi.org/10.1007/s00484-016-1172-5>
- Middel, A. and Krayenhoff, E.S., 2019: Micrometeorological determinants of pedestrian thermal exposure during record-breaking heat in Tempe, Arizona: Introducing the MaRTy observational platform. *Sci. Total Environ.* 687, 137–151. <https://doi.org/10.1016/j.scitotenv.2019.06.085>
- Milošević, D., Trbić, G., Savić, S., Popov, T., Ivanišević, M., Marković, M., Ostojić, M., Dunjić, J., Fekete, R., and Garić, B., 2022a: Biometeorological conditions during hot summer days in diverse urban environments of Banja Luka (Bosnia and Herzegovina). *Geographica Pannonica* 26(4), 29–45. <https://doi.org/10.5937/gp26-35456>
- Milošević, D., Middel, A., Savić, S., Dunjić, J., Lau, K., and Stojšavljević, R., 2022b: Mask wearing behavior in hot urban spaces of Novi Sad during the COVID-19 pandemic. *Sci. Total Environ.* 815, 152782. <https://doi.org/10.1016/j.scitotenv.2021.152782>
- Milovanović, B. 2015: Air Temperature Changes in Serbia and Belgrade Heat Island. *Journal of the Geographical Institute "Jovan Cvijić" SASA* 65(1), 33–42. <https://doi.org/10.2298/IJGI1501033M>
- Milovanović, B., Ducić, V., Radovanović, M., and Milivojević, M., 2017: Climate regionalization of Serbia according to Köppen climate classification. *Journal of the Geographical Institute "Jovan Cvijić" SASA* 67(2), 103–114. <https://dais.sanu.ac.rs/123456789/12570>

- Milovanović, B., Radovanović, M., and Schneider, C., 2020: Seasonal Distribution of Urban Heat Island Intensity in Belgrade Serbia. *Journal of the Geographical Institute "Jovan Cvijić" SASA* 70(2), 163–170. <https://doi.org/10.2298/IJGI2002163M>
- Morakinyo, T.E., Ouyang, W., Lau, K.K.L., Ren, C., and Ng, E., 2020: Right tree, right place (urban canyon): Tree species selection approach for optimum urban heat mitigation-development and evaluation. *Sci. Total Environ.* 719, 137461. <https://doi.org/10.1016/j.scitotenv.2020.137461>
- Oke, T., Mills, G., Christen A, and Voogt, J., 2017: *Urban Climates*. Cambridge University Press, Cambridge, UK.
- Oliveira, A., Lopes, A., Correia, E., Niza, S., and Soares, A., 2021: An urban climate-based empirical model to predict present and future patterns of the Urban Thermal Signal. *Sci. Total Environ.* 790, 147710. <https://doi.org/10.1016/j.scitotenv.2021.147710>
- Pecelj, M., Matzarakis, A., Vujadinović, M., Radovanović, M., Vagić, N., Đurić, D., and Cvetković M., 2021: Temporal Analysis of Urban-Suburban PET, mPET and UTCI Indices in Belgrade (Serbia). *Atmosphere-Basel* 12(7), 916. <https://doi.org/10.3390/atmos12070916>
- Quanz, J.A., Ulrich, S., Fenner, D., Holtmann, A., and Eimermacher, J., 2018: Micro-scale variability of air temperature within a local climate zone in Berlin, Germany, during summer. *Climate* 6, 5. <https://doi.org/10.3390/cli6010005>
- Republic Hydrometeorological Service 2021: Republic Hydrometeorological Service, Belgrade, Serbia. available at: https://www.hidmet.gov.rs/ciril/meteorologija/klimatologija_produkti.php
- Republic Hydrometeorological Service 2022: Republic Hydrometeorological Service, Belgrade, Serbia. available at: https://www.hidmet.gov.rs/ciril/meteorologija/klimatologija_srednjaci.php
- Savić, S., Trbić, G., Milošević, D., Dunjić, J., Ivanišević, M., and Marković, M., 2022: Importance of assessing outdoor thermal comfort and its use in urban adaptation strategies: a case study of Banja Luka (Bosnia and Herzegovina). *Theor. Appl. Climatol.* 150, 1425–1441. <https://doi.org/10.1007/s00704-022-04237-8>
- Shi, Y., Ren, C., Zheng, Y., and Ng, E., 2016: Mapping the urban microclimatic spatial distribution in a sub-tropical high-density urban environment. *Architectural Science Review* 59(5), 370–384. <https://doi.org/10.1080/00038628.2015.1105195>
- Shi, Y., Lau, K.K.L., Ren, C., and Ng, E., 2018: Evaluating the local climate zone classification in high-density heterogeneous urban environment using mobile measurement. *Urban Clim.* 25, 167–186. <https://doi.org/10.1016/j.uclim.2018.07.001>
- Shingala, M. and Rajyaguru, A., 2015: Comparison of Post Hoc Tests for Unequal Variance. *Int. J. New Technol. Sci. Engin.* 2(5), 22–33.
- Skarbit, N., Stewart, I. D., Unger, J., and Gál, T., 2017: Employing an urban meteorological network to monitor air temperature conditions in the ‘local climate zones’ of Szeged, Hungary. *Int. J. Climatol.* 37, 582–596. <https://doi.org/10.1002/joc.5023>
- Schnell, I., Cohen, P., Mandelmlch, M., and Potchter, O., 2021: Portable - trackable methodologies for measuring personal and place exposure to nuisances in urban environments: Towards a people oriented paradigm. *Comput. Environ. Urban* 86, 101589. <https://doi.org/10.1016/j.compenvurbsys.2020.101589>
- Stewart, I.D. and Oke, T.R., 2012: ‘Local Climate Zones’ for urban temperature studies. *Bull. Amer. Meteorol. Soc.* 93, 1879–1900. <https://doi.org/10.1175/BAMS-D-11-00019.1>
- Stoline, M.R., 1981: The Status of Multiple Comparisons: Simultaneous Estimation of All Pairwise Comparisons in One-Way ANOVA Designs. *The American Statistician* 35(3), 134–141. <https://doi.org/10.1080/00031305.1981.10479331>
- Šećerov, I., Savić, S., Milošević, D., Arsenović, D., Dolinaj, D., and Popov, S., 2019: Progressing urban climate research using a high-density monitoring network system. *Environ. Monit. Assess.* 191, 89. <https://doi.org/10.1007/s10661-019-7210-0>
- Tamhane, A.C., 1979: A Comparison of Procedures for Multiple Comparisons of Means with Unequal Variances. *J. Am. Stat. Assoc.* 74(366), 471–480. <https://doi.org/10.1080/01621459.1979.10482541>
- Tan, Z., Lau, K.K.L., and Ng, E., 2016: Urban tree design approaches for mitigating daytime urban heat island effects in a high-density urban environment. *Energ. Buildings* 114, 265–274. <https://doi.org/10.1016/j.enbuild.2015.06.031>

- Tan, Z., Lau, K.K.L., and Ng, E., 2017: Planning strategies for roadside tree planting and outdoor comfort enhancement in subtropical high-density urban areas. *Build. Environ.* 120, 93–109. <https://doi.org/10.1016/j.buildenv.2017.05.017>
- Tong, S., Prior, J., McGregor, G., Shi, X., and Kinney, P., 2021: Urban heat: an increasing threat to global health. *BMJ-Brit. Med/J.* 375, n2467. <https://doi.org/10.1136/bmj.n2467>
- Top, S., Milošević, D., Caluwaerts, S., Hamdi, R., and Savić, S., 2020: Intra-urban differences of outdoor thermal comfort in Ghent on seasonal level and during record-breaking 2019 heat wave. *Build. Environ.* 185, 107103. <https://doi.org/10.1016/j.buildenv.2020.107103>
- Tuholske, C., Caylor, K., Funk, C., Verdin, A., Sweeney, S., Grace, K., Peterson, P., and Evans, T., 2021: Global urban population exposure to extreme heat. *PNAS* 118, e2024792118. <https://doi.org/10.1073/pnas.2024792118>
- Uger, J., Skarbit, N., and Gál, T., 2018: Evaluation of outdoor human thermal sensation of local climate zones based on long-term database. *Int. J. Biometeorol.* 62, 183–193. <https://doi.org/10.1007/s00484-017-1440-z>
- Venter, Z.S., Brousse, O., Esau, I., and Meier, F., 2020: Hyperlocal mapping of urban air temperature using remote sensing and crowdsourced weather data. *Remote Sens. Environ.* 242, 111791. <https://doi.org/10.1016/j.rse.2020.111791>