



Drone-based Optimization and Validation of Numerical Simulations of Urban Heat Islands

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Abstract

In this ongoing research project, advanced drone technology is employed in conjunction with simulation models to assess the impacts of urban climate, with a specific focus on Urban Heat Islands (UHI). The novel methodology was tested in the historical downtown areas of two German cities. Through the creation of high-resolution 3D-models of urban structures and the analysis of material properties, the research project aims to accurately predict the climate impacts of urban planning decisions.

The results of the project provide planners with precise insights for evaluating adaptation measures and mitigating the adverse effects of climate change in cities, ultimately improving living conditions therein. The research undertaking also pioneers the use of high-temporal-resolution drone data for analyzing temperature patterns and considers various contributions to the heat island effect for comprehensive climate-adaptive urban planning.

Introduction

The ongoing project investigates the localized climatic impact of urban development, an issue of increasing significance due to climate change, commonly referred to as "*Urban Heat Islands (UHI)*." Urban structures influence urban climate in various ways. In addition to geometric considerations, material properties such as thermal mass and radiative behavior of surfaces such as roads, roofs, and facades also influence the local climate. The specific contributions and combinations of these factors, particularly those causative for the formation of UHI's, remain open questions. Additionally, the precise locations and extents where vegetation and water surfaces can have a maximally positive influence on the local climate are not conclusively clarified.

The overarching goal of the research project is to generate climate predictions using urban simulation models, providing reliable recommendations to support integrated and climate-adaptive urban planning aimed at mitigating urban heat islands. This aims to improve the quality of life and stay in cities.

To achieve this goal, precise input data must be captured for the simulation model. Additionally, simulation results need validation against real data to adjust simulation parameters if necessary. In the research project, highly detailed simulation models for the urban structure of two historic German city centers are developed based on the new methodological approach described below. With these models, urban planning decisions can be simulated and scientifically evaluated with high accuracy. Cities can use this information to assess the impacts of specific adaptation measures and proactively contribute to mitigating the effects of climate change.

In the research project, the urban development of the two cities is captured in its authentic form by a drone equipped with LiDAR sensor, hyperspectral sensor, and thermographic camera. The generated high-resolution terrain model, both geometrically and materially, is then transferred to the numerical simulation program ENVI-met (V5.1.1). It is processed in a microclimatic 3D model for predicting the behavior of urban heat islands. The integration into the model is achieved through point cloud interpretation and spectral analyses, enabling the three-dimensional representation of the urban space and the capture of surface materiality (facade, roof, road, and path surfaces).

The climate prediction generated from the simulation can be subsequently validated with real data from drone-based thermographic recordings (e.g., by comparing simulated surface temperatures of the urban area with values measured from thermography). With validated simulation settings, it is possible to represent simulation-based predictions of the development of urban climate in a more realistic manner and thus more precisely reflect the outcomes, for example, through greening and other optimization measures.

The described approach differs from current methods of digital terrain modeling and climate simulation in the desired resolution and execution. While past and current approaches rely on various data sources, the entire data generation and processing are undertaken by the researchers in this project. The advantage over satellite re-

remote sensing data lies in the higher resolution of the generated surface model due to the better ground resolution of the recordings. Additionally, independence from cloud cover and other atmospheric influences is maintained. Any inaccuracies that persist despite atmospheric corrections are thus eliminated. The high temporal resolution of drone flights (capturing the thermal behavior through multiple flights in a day) is also a new approach in the assessment.

Literature review

Subsequently, a brief exemplary literature review is conducted, encompassing both the subject of urban heat islands and the employed remote sensing and simulation methodologies associated with it. This analysis incorporates the current state of scientific knowledge, while also delving into supplementary and novel approaches within the ongoing research project.

Due to the deleterious impacts of UHI's on urban populations, there has been a notable escalation in research on urban microclimates in recent years [7], [25]. Early investigations primarily delved into understanding the relationships between population density and heat island intensity, temperature differentials between urban centers and their surroundings, and the dependencies on locally encountered boundary conditions [11], [16], [17], [18]. Present-day inquiries have shifted towards exploring strategies and measures for adapting to and mitigating the effects of climate change on urban areas [4]. The importance of remote sensing in urban contexts has been steadily increasing [2], [3]. Several research endeavors have concurrently addressed both remote sensing and simulation methodologies in the examination of urban heat islands [1], [9], [10], [21]. In these studies, data derived from satellite and aircraft-based imaging were meticulously analyzed and evaluated. The findings suggested that urban heat islands can be observed in their manifestation from Low Earth Orbit, and data obtained from the reflection spectra of urban surfaces are transferable to climatic simulations [9]. However, the chief challenge in such investigations lies in the availability of data and the spatial and temporal resolution of the acquired datasets [21].

The envisioned research methodology of employing drone flights in this project is designed to confront the challenges posed by data availability and spatial-temporal resolution. By capturing temporal changes in the thermal behavior of surfaces, it is anticipated that novel insights into input parameters for climate simulations will be gained. This approach allows for the generation of daily temperature profiles for entire neighborhoods, facilitating a more precise creation and validation of climatic simulations than was previously achievable. The high temporal and spatial resolution of drone-based data

collection also enables the consideration of traffic-induced contributions to the Urban Heat Island effect.

Methodical approach

The research design of the project mandates the integration of diverse research methods. The primary aim is to attain the utmost precision in predicting climatic impacts arising from urban planning decisions via urban simulations. To achieve this goal, meticulous acquisition of both geometric and material input data is planned through drone flights and subsequent integration into the simulation program. Furthermore, the simulation outcomes of the current urban scenario will undergo validation against authentic climate measurements (Figure 1).

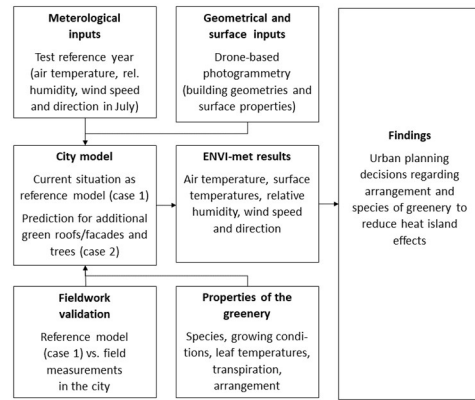


Figure 1: Overview of the methodical approach (in accordance with [26])

The field experiments were specifically conducted in the historic city centers of Würzburg (Bavaria) and Meiningen (Thuringia). These cities exhibit similarities in their architectural characteristics and urban features, encompassing structural construction, degree of sealing, parks, and water bodies. This intentional selection aimed to establish a robust and doubly verified foundation for the fundamental input parameters within the ENVI-met simulation program.

Initially, a quantitative approach for data collection, quantification, and analysis of measurements was implemented through a combination of drone flights and ground-based climate measurements. For data collection, a drone equipped with appropriate sensors, including an optical camera, hyperspectral sensor, and thermographic camera, was employed to capture thermal and material-specific surface properties. Rigorous planning and targeted programming of the drone and sensors, encompassing factors such as flight route and altitude, trigger interval, sensor orientation, and camera settings, were implemented to ensure data consistency, collected at a uniform height and distance, maintaining high-quality standards.

For instance, Figure 2 illustrates thermographic recordings obtained through drone flights over the city center of Meiningen at approximately 4:00 pm on a summer day with an air temperature of around 30°C. In contrast, Figure 3 displays thermographic recordings of the city park at 2:00 pm. Figure 4 provides a visualization of the distributed measurement points, encompassing temperature, relative humidity, and wind speed, within the simulated segment of the city (396 m x 198 m).

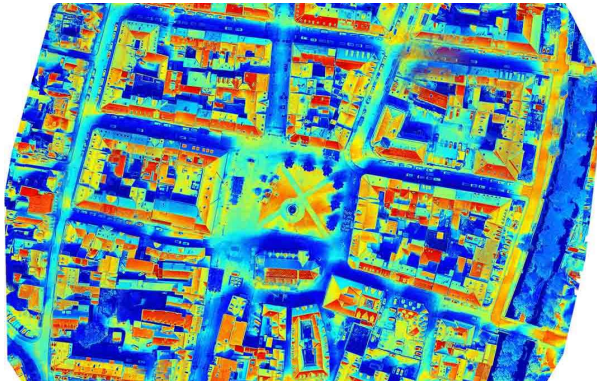


Figure 2: Drone-based thermographic recordings of a city center with a marketplace at 4:00 pm for subsequent validation of simulation results

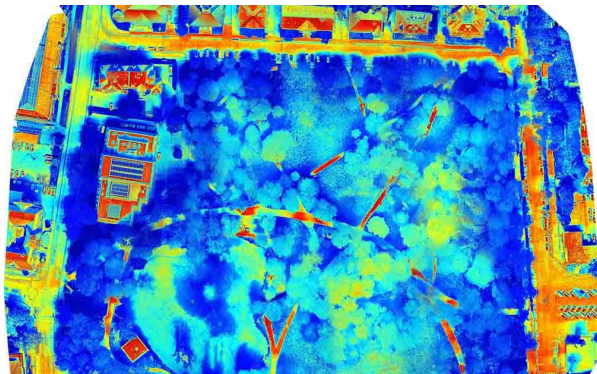


Figure 3: Drone-based thermographic recordings of the city park at 2:00 pm for later validation of simulation results.

The quantitatively determined measurement values serve as the foundational dataset for the subsequent simulation-based methodology aimed at predicting urban heat islands. In this approach, the measured surface characteristics constitute the basis of the simulation model. Simultaneously, the empirically measured thermal conditions provide a means to validate the initial state of the urban heat island.

A parameter study is then employed to scrutinize specific parameters/settings in the simulation, assessing their impacts on the results. This involves a comparative analysis

to determine whether the altered parameters lead to a greater or lesser degree of agreement with the measurements. The parameter study is designed to systematically investigate the behavior of the urban simulation model under various conditions, facilitating the identification of relationships between the parameters and the simulation results. This methodological approach, involving the systematic variation of parameters, enables the quantification of impacts on the simulation model and the determination of potential cause-and-effect relationships.

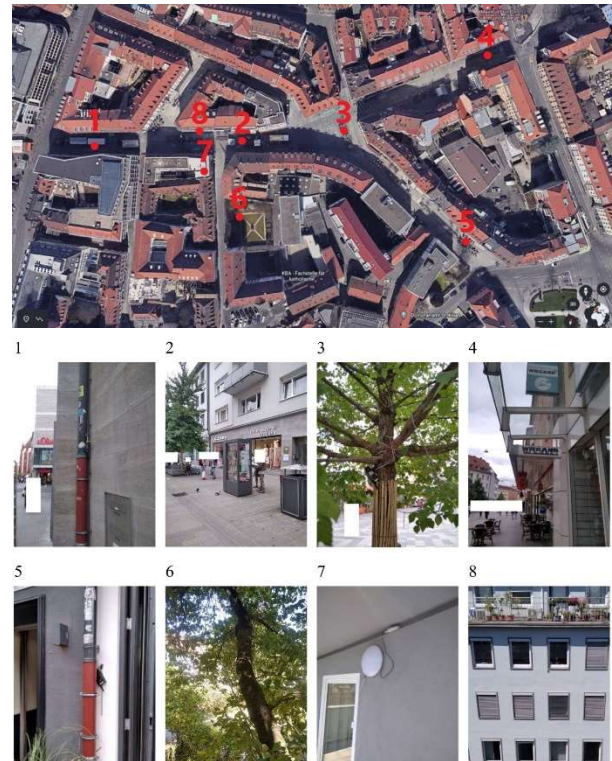


Figure 4: Ground-based measurement points for air temperature, relative humidity, and wind speed distributed throughout the inner city.

Following a secure understanding of the effects of specific parameter settings, the simulative prediction of Urban Heat Island behavior is undertaken. Starting from a validated current state, measures to mitigate the UHI effect can be simulated, and their effects can be accurately assessed.

Drone-based data acquisition

The quantitative data collection method relies on drone technology, specifically utilizing the DJI Matrice 300 RTK drone equipped with the optical camera and thermographic sensor from the DJI Zenmuse H20T system. Additionally, the inclusion of a hyperspectral camera is planned. This comprehensive setup facilitates the photogrammetric acquisition of terrain and surfaces, allowing

for the registration of their surface temperatures and the recording of the spectral signature of horizontal surfaces. The targeted study areas encompass the historical city centers of Würzburg (Bavaria) and Meiningen (Thuringia), sharing architectural and urban similarities.

The material classifications of urban surfaces are captured in a subsequent aerial survey along the programmed flight route using a hyperspectral camera. In contrast to a conventional RGB camera, a hyperspectral camera operates with a multitude of channels rather than just three (red, green, blue). The number of channels typically ranges from approximately 100 to 300 in sensors suitable for drones. This enables the identification of a continuous reflection spectrum from individual surfaces. The spectral range of acquisition generally spans wavelengths between 500 nm and 2500 nm. Through the assessment of reflectance levels at specific wavelengths and wavelength ranges, conclusions can be drawn regarding the surface material, water quality, or vegetation.

Photogrammetric and hyperspectral captures are executed as singular events, while thermographic captures are scheduled to recur at intervals of 2 – 4 hours throughout a 24-hour period. The planned flight altitude is established at 120 meters above ground, optimizing coverage in a single capture and streamlining regulatory approval processes, aligning with the lower airspace risk criteria outlined in the Specific Operation Risk Assessment (SORA) by the European Union Aviation Safety Agency (EASA). The quantitatively derived measurement values form the foundational dataset for the subsequent simulation-based methodology aimed at predicting urban heat islands. The optical camera records images in JPG format, while the thermographic camera utilizes the proprietary R.JPG format for image storage.

Photogrammetrically processed optical captures generate a point cloud, forming the basis for a three-dimensional digital surface and terrain model (DSM, DTM). The processing of data involves the utilization of Pix4Dmapper, ArcGIS Pro and QGIS software. Differentiation among road, facade, and roof surfaces, as well as vegetated areas, is a requisite step. Hyperspectral data undergoes material classification through spectral analysis, determining the material composition of each pixel. An assessment of reflectance across the entire captured spectrum (albedo) serves to validate the physical literature values embedded in the simulation software ENVI-met, prompting adjustments in the case of significant deviations.

The amalgamation of this information results in a comprehensive microclimatic simulation model within the QGIS software environment, facilitated by the ENVI-met plugin. Subsequently, this model undergoes simula-

tion within the ENVI-met platform. The approach of analyzing image data and implementing the resultant holistic surface model in the simulation software aligns with the research contributions of Heldens, specifically focusing on the integration of remote sensing surface information into a 3D-microclimatic model [10].

Microclimatic simulation with ENVI-met

The microclimatic simulation of Würzburg and Meiningen city centers, including their immediate surroundings, utilized the ENVI-met software (Version 5.1.1). This software facilitates the prediction, analysis, and visualization of urban microclimates, incorporating parameters such as air and surface temperature, humidity, wind, and radiation. The microclimatic model is grounded in fundamental principles, drawing from fluid mechanics, thermodynamics, and atmospheric physics. The simulation comprehensively considers interactions among facades, road surfaces, vegetation, emission sources, and the air.

Geometric city models and urban surface characteristics were derived from data acquired through drone-based photogrammetry and spectral analysis. Climatic data originated from measurements gathered by weather stations in Würzburg and Meiningen. To enhance computational efficiency, a horizontal resolution of $2\text{ m} \times 2\text{ m}$ was adopted for the simulated model area (see Fig. 5), corresponding to 198×99 grid cells horizontally. The vertical extent of the model was confined to 15 cells, each 3 m in height. Recognizing the significance of surface temperatures within the lowest three meters, the resolution of the bottom layer of grid cells was increased. Above buildings, vertical resolution was reduced to optimize computation time. The resulting 3-dimensional model consists of nearly 300,000 cells, each assessable on an hourly basis over the entire 48-hour simulation period.

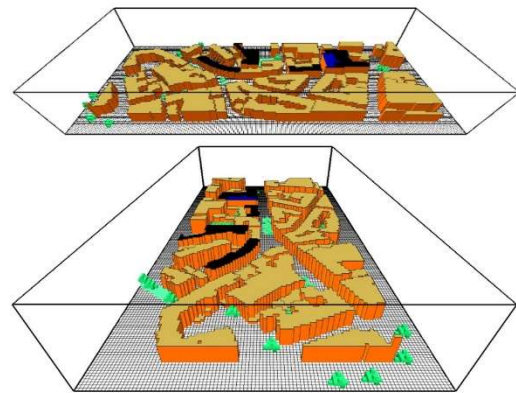


Figure 5: Simulation model of the city center of Würzburg (Bavaria, Germany) with a grid resolution of 198×99 cells ($2\text{ m} \times 2\text{ m}$) in the horizontal plane and 15 cells (3 m) in the vertical direction.

The majority of buildings in the simulated urban areas date back to the 19th and 20th centuries, leading to the assumption that these structures are uninsulated and constructed with solid materials, likely including various mineral masonry stones. The model presumes walls made of brick. In the simulation, facades are treated as completely closed, and existing windows are excluded from climatic analysis. Similarly, emissions from morning delivery traffic were disregarded. Table 1 presents the physical parameters (albedo, emissivity, and surface roughness) employed in the simulation.

Table 1 Summary of surface information.

Type	Albedo	Emissivity	Roughness Length
Soil	0.20	0.95	0.015
Asphalt Road	0.20	0.90	0.010
Gravel	0.20	0.90	0.010
Concrete Pavement	0.35	0.90	0.010
Faade	0.50	0.90	0.020
Roof Tile (sloped)	0.20	0.90	0.020
Roof Surface (flat)	0.20	0.90	0.020
Green Roof	0.20	0.70	0.020

The topography of the studied urban areas was omitted from the models, as the terrain slope in both cities consistently remains below 1%, rendering its impact on the microclimate negligibly small. Vegetation in the studied urban areas is limited to a few trees and small green spaces. The simulated trees exhibit insignificant variations in relevant aspects and are represented in the simulation by a fictitious tree model. The simulated tree's characteristics resemble those of a young maple: a deciduous tree with seasonal foliage, standing at a height of 6.50 meters and a crown diameter of 5 meters (see Table 2).

Table 2 Summary of tree and greening information.

Tree Name	Leaf Type	Crown Width	Tree Height
Case 1			
Norway Maple (young)	deciduous	5 m	6.5 m
Case 2			
Norway Maple (young) +	deciduous	5 m	6.5 m
Ivy +		-	-
Green Roof		-	-
Case 3			
Norway Maple (middle) +	deciduous	15 m	13 m
Ivy +		-	-
Green Roof		-	-

The influence of greenery on the urban microclimate was explored through model variations. Case 1 represents the current state, while Case 2 involves the full-scale greening of all facades and flat roofs. For Case 2, ground-based greening with ivy was chosen, as retrofitting existing buildings with ground-based facade greening is considerably simpler than facade-based greening. Extensive roof greening was implemented with various plants on a substrate layer and a thin underlying insulation layer. In another scenario (Case 3), existing trees in the pedestrian zone were replaced and supplemented, with the same tree used in a later growth phase.

These three model variations were simulated with different climatic input parameters. In addition to weather station data for simulating the current climate (measured values during a heatwave in 2022), the summer-focused Test Reference Year 2045 (TRY45) from the German Weather Service was used as a climatic forecast. Unfortunately, the data did not include information on solar radiation, but this should be considered in future simulations. All simulations performed were using the meteorological boundary conditions of the simple forcing method.

Results

The primary objective of the research project is to achieve a highly precise forecast of the urban climate within the broader context of climate predictions. Specifically, the project aims to predict the impact of urban greening on mitigating heat islands resulting from urban planning decisions. Intermediate goals toward this primary objective include the collection of high-resolution drone-based data for the generation of a precise simulation model.

Additionally, the model's input data will undergo calibration through real-world measurements. The subsequent presentation of results includes the validation of simulation outcomes through climate measurements, followed by the projection of the urban climate with additional greening measures, such as trees, facades, and roofs.

Drone-based validation

The simulation results are cross-referenced with thermographic images to evaluate the congruence between the simulated current state and the measured values. In this comparison, indicators such as the simulated mean radiant temperature and the measured surface temperature are utilized. These indicators are assessed across various surface types and specific areas to provide a detailed analysis of the simulation's accuracy in representing the observed conditions.

Fieldwork validation

The validation of the simulation was based on comparing measured and simulated values of relative humidity, air temperature, and surface temperature of the examined facade. Values were extracted from the model's 'Grid Cells,' corresponding to the measurement points, and then compared with the measured results.

As shown in Figures 6, 7, and 8, these figures exemplify the comparison between the locally measured surface temperature of a facade (Fig. 6) and the simulated surface temperatures of the facade in the model (Fig. 7).

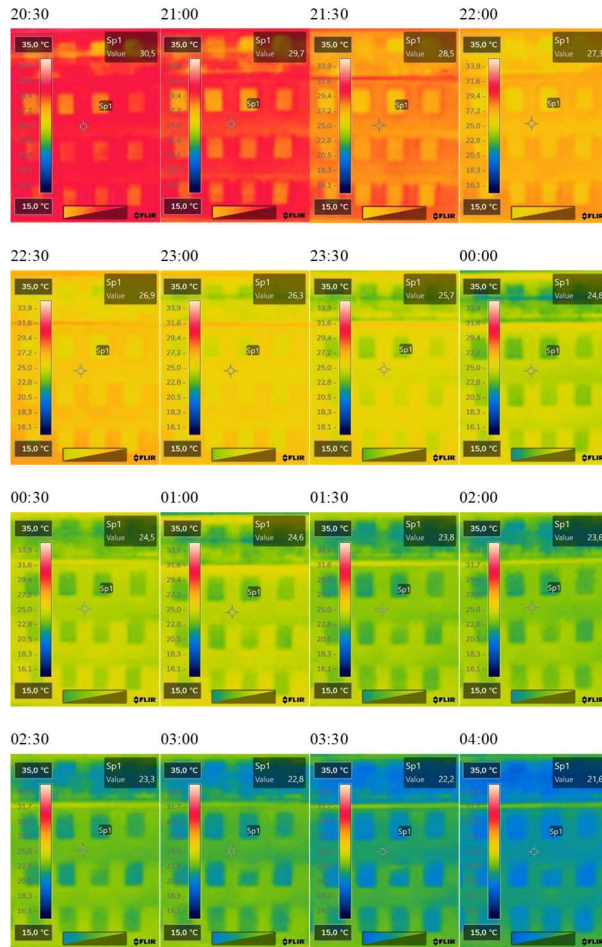


Figure 6: Thermographic images of a house facade taken every 30 minutes from 8:30 pm to 4:00 am. Overnight, there is a decrease in surface temperature of approximately 9 K at the reference point.

The excellent correlation in the decrease of surface temperature between measurement and simulation is apparent in Figure 8. Similar good agreements were determined for the air temperatures. In contrast, there was a low level of agreement for relative humidity and air velocity.

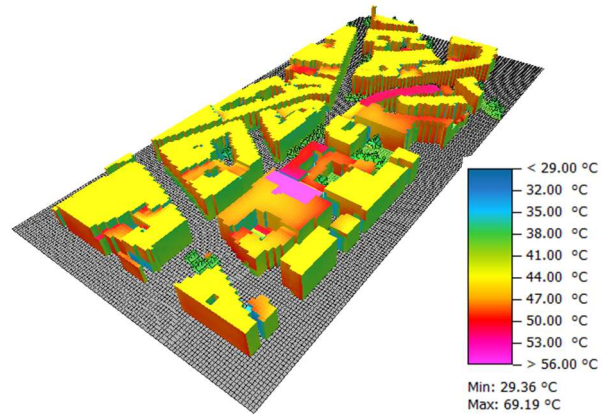


Figure 7: Representation of the surface temperatures of the facades in the downtown area in the simulation model.

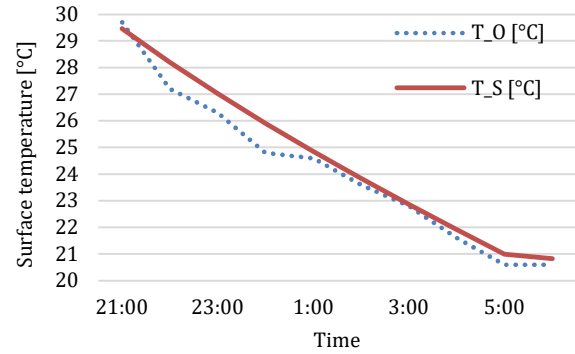


Figure 8: Comparison of the measured (T_O , blue) and the simulated (orange, T_S) surface temperature of a facade in the downtown area.

The fidelity of the performed simulations in accurately representing reality was evaluated through a statistical validation of the model. Table 3 presents statistical measures, including the coefficient of determination (R^2), Willmott's index of agreement (d), Root Mean Square Error (RMSE), and Mean Absolute Error (MAE), specifically for air temperature. It is important to note that the deviations observed at measurement point 2 can be attributed to the placement of the data logger on a highly heated metallic surface.

Table 3 Statistical validation of the simulation results with real climate measurements (i) conducted on-site.

i	R^2 [-]	d [-]	RMSE [°C]	MAE [°C]
1	0.922	0.935	2.004	1.743
2	0.844	0.812	4.361	3.093
3	0.937	0.948	1.864	1.580
4	0.927	0.954	1.895	1.679
5	0.950	0.947	1.791	1.331
6	0.922	0.888	2.894	2.387
7	0.917	0.914	2.468	1.969

Numerical simulation results

The assessment of the simulation results for the current condition (Case 1) was previously conducted through the validation process with on-site measurements. In this section, we examine the predicted results of the urban climate from the simulation for a scenario involving extensive greening of the urban area (Case 2). Of particular interest is the extent to which theoretically maximal greening through additional trees, facade greening, and roof greening can enhance the existing urban climate.

Figure 9 illustrates the temperature differences between Case 1 and Case 2. Notably, the observed temperature difference between the two models is smaller than anticipated. With extensive greening, the air temperature decreases by a maximum of approximately 0.8 K and, on average, only by about 0.2 K.

The most significant temperature variations are primarily observed in small, confined areas characterized by a high density of vegetation and limited wind influence, such as courtyards surrounded on all sides by green facades (as depicted in Fig. 9).

The relatively low temperature differences noted at the northern and eastern edges of the simulation model (attributed to exceptionally high air temperatures in this region) underwent further investigation through an additional simulation involving a modified wind direction. This analysis revealed a pronounced dependence of the temperature distribution on the wind direction.



Figure 9: Temperature difference between Case 1 (current state) and Case 2 (maximum greening). The air temperature decreases by an average of approximately 0.2 K and a maximum of about 0.8 K due to greening

In addition to reducing air temperature, the extensive greening of urban spaces in Case 2 was anticipated to affect the surface temperatures of buildings. Due to the generally similar architectural characteristics, the roofs in the reference model (Case 1) exhibited mostly minor temperature differences. Significant surface temperature increases were observed exclusively in areas where photovoltaic elements were installed, owing to their higher radiation absorption.

The predicted differences in surface temperatures between Case 1 and the greened surfaces in Case 2 are substantial. It is essential to note that the temperatures considered are those of the exterior sides of walls and roofs, not the surface temperature of the facade or roof greening. Particularly on the roofs, this leads to significant temperature variations. One contributing factor is the additional roof structure with a substrate layer for greening. The highest differences amount to approximately 20 K.

In Figure 10, the left column illustrates surface temperatures for the reference case, while the right column displays the results with greening of facades and roofs in time intervals of 4 hours between 8:00 am and 8:00 pm for a day in July. In both cases, nighttime cooling occurred, aligning with real-world observations (as shown in Fig. 8).

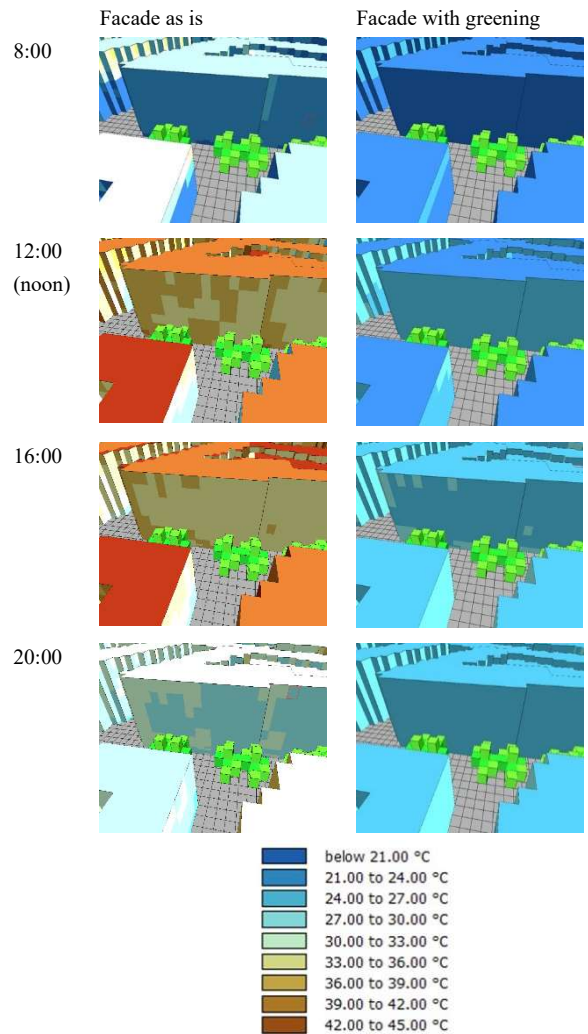


Figure 10: Variation of surface temperatures of a facade on a day in July between 8:00 am and 8:00 pm in the existing condition (left column) and with facade and roof greening (right column).

Throughout the day, surface temperatures of buildings exhibit a warming trend starting from 8:00 am, reaching peak values between 12:00 pm and 4:00 pm. The temperature scaling was set at 3 K due to significant temperature differences on roof surfaces. In the reference case, the facade's surface temperature is approximately 21 °C at 8:00 am and rises to about 39 °C at 12:00 pm. Conversely, in the greened case (Case 2), the initial value at 8:00 am is below 21 °C, and the facade's temperature peaks at approximately 24 °C throughout the day. A detailed analysis identified the highest differences of up to approximately 20 K.

The influence of shadows cast by buildings and trees on facade surfaces is evident in the results of surface temperature. Especially in lower facade areas, this results in lower temperatures (see Fig. 11).

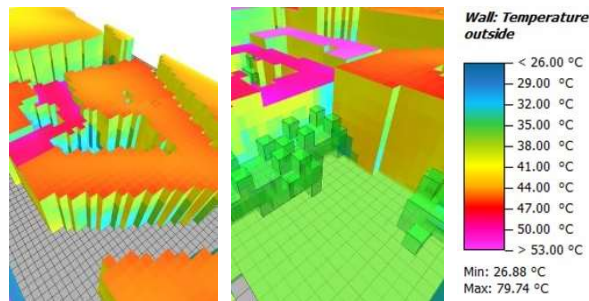


Figure 11: Reduction of surface temperature through architectural shading (left) or shading of the facade by trees (right).

Discussion

Through drone-based acquisition of baseline data (geometric and material-related data) for urban areas, a high-resolution simulation model was input into ENVI-met. The reference models used for simulating the current situation and the comparison of results with actual on-site climate measurements yielded a high level of agreement.

Based on this foundation, initial predictions regarding the development of the urban climate to mitigate urban heat islands were formulated when significantly more greening would be implemented in urban areas. However, the simulation results initially did not show clear improvements in the form of a noticeable reduction especially in air temperatures, as required for mitigating urban heat islands. This aligns with the findings of other studies (e.g. [20]). Against this backdrop, the numerous influencing factors on the development of the urban climate, which can also be represented and assessed in the simulation, need further analysis. Significant dependence on wind direction has already been identified.

The green plants used also need to be examined more closely for their impact. Furthermore, the models could

be supplemented with water surfaces or water features. However, attention must be paid to considering additional practical conditions (e.g., public building regulations, fire protection, water requirements of plants, structural prerequisites for greening such as substructure for roofs and facades, maintenance needs, economic operating costs, etc.). Close coordination with decision-makers in cities and municipalities is necessary in this regard.

In terms of general conclusions from the investigations, urban structures need to be examined more closely. It is essential to identify which parameters (e.g., city location, prevailing wind direction, extent of water and green areas, building distances and heights, etc.) lead to more positive or more negative influences on the urban climate.

Conclusion

The initial findings of the ongoing research project indicate that climatic conditions in cities can be well predicted using the simulation program ENVI-met. The validation of results from the reference models with real climate measurements in the cities revealed a high degree of agreement.

Based on this foundation, subsequent forecasts for the evolving urban climate with maximal greening of the city center were formulated. Additional trees were integrated into the model, and all suitable facades, as well as roofs, were assumed to be greened. It was observed that the predicted air temperatures only changed slightly due to comprehensive greening. On average, there was a decrease of approximately 0.2 K in street areas and a maximum reduction of about 0.8 K in sheltered courtyards. The influence of wind direction on simulation results was demonstrated by varying the wind direction in the simulation.

Accurate geometric data on building structures and their construction materials and surface characteristics were crucial for obtaining reliable simulation values. Advanced drone technology with appropriate sensors was employed for this purpose. In comparison to the traditional method, the drone-based approach exhibits improvements both in the temporal input of the model and in its accuracy, particularly regarding building heights and surface characteristics. Freely available three-dimensional city models, such as those from OpenStreetMaps, lack information on building heights and surface characteristics for the studied area. Commercial maps containing such information often come with significant costs and limitations in usability. Additionally, the use of a thermal camera provides an advantage in determining the current state and validating the model. Drone-captured thermograms can be acquired much faster (and from a better angle) compared to ground-based surveys. The latter would require the individual

capture and examination of each facade, focusing only on selected facades, while drones provide access to analyze every facade in the surveyed urban area.

For surface characteristics, spectral data yields more precise results than visual observation and estimation of surface conditions. The computational implications of this increased accuracy in assigning surface characteristics, however, need further evaluation in subsequent studies. Nonetheless, there is at least a temporal advantage over manual surface data collection in this context.

Equally important was the validation of the simulation's reference model, which also utilized drone-based thermographic recordings. The comparison of on-site climate data with simulated values showed a very good agreement.

In summary, the combination of drone-based data acquisition and its integration into the ENVI-met simulation program leads to high accuracy in urban climate predictions. Alongside detailed model input through georeferenced data, this approach enables the (significantly) faster input of urban models into the software. Furthermore, drone surveys can provide valuable additional parameters such as material characteristics of surfaces and surface temperatures.

Finally, it is imperative to acknowledge that the utilization of unmanned aerial vehicles (drones) introduces a multifaceted challenge, encompassing the judicious selection of appropriate drone hardware, software, and data analysis tools tailored to the specific application. Additionally, strict adherence to formal regulatory requirements is essential, particularly in Germany and Europe. It is reasonable to presume that analogous regulatory considerations are pertinent in other countries and continents.

In Germany, for instance, compliance extends beyond obtaining a remote pilot's license; it necessitates the acquisition of a permit for urban overflights from both the municipal authorities and the aviation regulatory body. The temporal duration required to secure such approvals should be factored into project timelines to ensure that activities can be scheduled during the desired seasons.

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