

Article

Quantitative Study on the Effects of Street Geometries and Tree Configurations on the Outdoor Thermal Environment

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Abstract: Global warming and the urban heat island effect has aroused the attention of research on the outdoor thermal environment. As outdoor spaces often used by citizens, streets play an important role in improving the thermal environment. In this study, six factors relating to street geometries and tree configurations in Busan are measured and quantified to form 32 typical scenarios. The degree of importance of these six factors is evaluated based on ENVI-met simulation results, and GeoDetector is introduced to evaluate the interactions between the factors and their impacts on the outdoor thermal environment. This study confirms the significantly higher impact of street geometry factors on the air temperature and physiological equivalent temperature compared to tree configuration factors. Particularly, H_b/W_s shows the most significant impact during the research period. The impact of interactions between any two factors of street geometry is much higher than that of interactions between the geometry and tree configuration factors and that of interactions between the tree configuration factors. We recommend dynamically adjusting the relationship between street geometry and tree configurations in different situations to improve the outdoor thermal environment, especially at noon and in the afternoon.

Keywords: street canyon; microclimate; thermal comfort; ENVI-met; GeoDetector



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1. Introduction

By 2050, approximately 70% of the population is predicted to live in cities, continuing the current trend of increasing urban populations [1]. Due to rapid urbanization, newer cities have become centers of stronger urban heat island effects rather than older ones [2]. Meanwhile, city expansion changes local atmospheric circulation [3], causing frequent occurrences of extreme weather including heatwaves and floods [4,5], which have a variety of adverse effects on human health [6,7] and ecosystems [8]. The existing urban-planning strategies require transformation to create sustainable cities and communities (SDG 11) that adapt to global climate change. Streets constitute > 80% of urban open space and play an important role in urban infrastructure [9]. As a social space, streets provide a platform for social behavior and experiences [10].

The microclimate of a city's local districts forms the urban climate, significantly assisting in determining the urban physical environment [11]. Various biometeorological indices describe the outdoor thermal environment by linking the microclimate and human activity [12,13], including the predicted mean vote [14], PET [15], and universal thermal climate index [16]. The efficiency of using the PET for measuring tropical, subtropical, and temperate regions has been verified by existing studies on the widely used thermal comfort index [17]. Street canyons form basic geometric units [18], and their key properties can be expressed with H_b/W_s values [19]. From the perspective of vegetation configurations,

increasing public green space [20], planting street trees [21–23], and roof greening [24,25] are considered good solutions to improve the outdoor thermal environment. However, street trees have a better cooling effect than grass and shrubs [22,26], as tree canopies block solar radiation, and reduce the TA in shadowed areas [27]. Meanwhile, transpiration by tree canopies increases environmental humidity [28,29]. Research on street trees mainly concentrates on the tree height [30,31], planting distance [11,32,33], canopy shapes [34–36], and green-cover ratios [37,38]. Geometric patterns and vegetation configurations have been proven to induce stronger effects than surface material and water body changes on improving the outdoor thermal environment [39,40]. Additionally, most existing studies have only focused on some factors, e.g., D_{bt} and D_t [11], or H_b/W_s and O_s [41], in different districts and weather conditions [40] when evaluating the outdoor thermal environment. Moreover, the effects of factor interactions on the outdoor thermal environment have also not been analyzed in detail.

Recently, numerous evaluation methods including field measurements [35,42], simulations [21,26,31,32,43], combinations of field measurements and simulations [30,37,44–47], and scaled models [34,48] have been developed to study and assess the outdoor thermal environment. Toparlar et al. confirmed that 46.7% of research was focused on more than one meteorological parameter measurement [49]. Microclimate models not only contain computational fluid dynamics software, including OpenFORM [50], ANSYS Fluent [51], and ENVI-met [52], but also involve user development programs such as MMRT [53] and COSMO-DCEP [54]. Particularly, ENVI-met is considered suitable for use with appropriate validation in most studies [52], and simulation results show a strong fit with measured values under different geometrical and meteorological conditions [55–58].

This study aims to comprehensively confirm the order of importance of street canyon factors and evaluate the characteristics of the outdoor thermal environment under heat-waves through field measurements, experimental design, and ENVI-met software. Meanwhile, the impact of factor interactions on the outdoor thermal environment is evaluated using GeoDetector through spatial heterogeneity analysis of the simulated results. Furthermore, this study is anticipated to provide a reference for street planning to regenerate old cities and develop new cities in cases of extremely hot weather conditions.

2. Materials and Methods

2.1. Study Area

Busan ($35^{\circ}05' N$, $128^{\circ}35' E$), located on the south-easternmost tip of the Korean Peninsula (Figure 1), is the economic, cultural, and educational center of southeast Korea. For this study, Nampodong, Seomyeon, and Centum City were selected as the targeted old, present, and new city-center sites to represent the urban development of Busan.

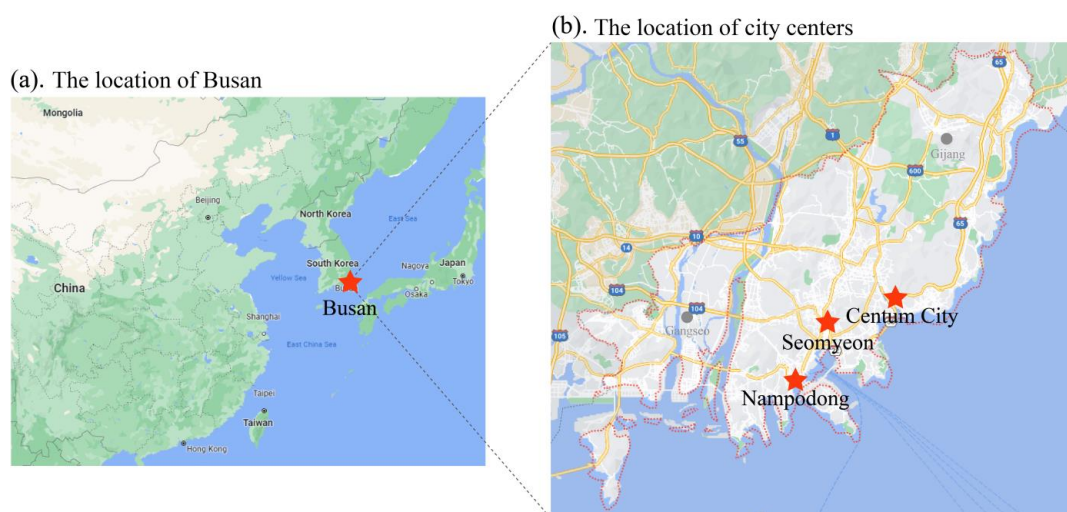


Figure 1. Site of Busan, South Korea.

According to the Köppen–Geiger climate classification, Busan has been classified at the border of Cfa and Cwa zones [59]. Reportedly, the mean annual temperature of Busan is 14.7 °C and its average summer precipitation is 778.7 mm, accounting for 51.2% of the annual precipitation. However, Busan was hit by unprecedented heat in August 2016: the official maximum temperature recorded was 37.3 °C (the highest in 112 years), with a maximum temperature of approximately 40 °C in some areas.

2.2. Field Measurements

2.2.1. Field Measurements of the Three City-Center Sites

To explore the existing street canyons of Busan, 15 representative sites were selected for investigation in the old, current, and new city-center areas. Most of these sites were situated along main streets and contained large commercial, administrative, or official buildings. Based on street geometry, the streets were divided into grids with 20 m spacing in each representative plot. For tree configuration characteristics, the D_{bt} and D_t were directly measured. Additionally, the H_t was calculated by estimating the top positions of tree crowns projected parallel to a building facade through single-story building height measurements.

The measurement results for the 15 representative sites are presented in Table 1. The buildings around the main streets of Nampodong are primarily low-rise buildings, but the scale of buildings gradually increases towards the newer developed parts of the city. The selected sites were centered on commercial buildings above 6 F. Among them, the W_s of OC4 was the smallest, but the average H_b/W_s was up to 1.3. Streets in the NS and EW directions and the SENW and NESW directions were centered on the south side and north side of Seomyeon, respectively. And most buildings reached heights of 6–12 F. Compared with Nampodong, the building height and W_s values were greater in Seomyeon. As a new part of the city, the heights and scale of buildings in Centum City were significantly higher than those in Nampodong and Seomyeon. The average H_b/W_s of NC2 reached 2.8, and the W_s of NC5 was 67 m. In terms of tree configuration, Nampudong and Seomyeon had fewer street trees, most of which were unevenly distributed on both sides of the main street. To maintain natural lighting for the buildings, the tree crowns were excessively pruned despite the high H_t due to the low D_{bt} . In contrast, the street trees in Centum City were mainly zelkova trees, evenly distributed on both sides of the street, and had a large D_{bt} . Additionally, since only shrubs existed in Centum City, which had a weak shading effect, this study did not consider the impact of shrubs.

Table 1. Field measurement results of the representative sites.
















Site ID	OC1	OC2	OC3	OC4	CC1	CC2	CC3	CC4
Image								
Street length (m)	105	137	148	156	146	154	211	170
W_s (m)	17	41	36	21	20	33	49	25
O_s	S by E 18°	E by S 16°	E by N 18°	E by N 16°	S by E 34°	N by E 32°	E	E
Ave. H_b/W_s	0.9	0.8	0.5	1.3	1.5	1.7	1.6	1.2
Ave. D_{bt} (m)	3.8	6.1	6	-	4.3	5.2	7.5	3.8
Ave. D_t (m)	8	12	10.7	-	6.2	9.6	13.2	10.2
Ave. H_t (m)	12.2	15.4	14.7	-	7.3	17.4	13.8	15.6
Tree species	Gingko	Gingko	Gingko	-	Zelkova	Platanus	Zelkova	Gingko

Table 1. Cont.

Site ID	CC5	CC6	NC1	NC2	NC3	NC4	NC5
Image							
Street length (m)	142	122	171	202	284	212	333
W_s (m)	25	33	34	36	44	38	67
O_s	S	S	S by E 34°	E by N 35°	E by S 29°	E by N 34°	E by N 34°
Ave. H_b/W_s	1	1.3	1.2	2.8	1.4	2.5	1.3
Ave. D_{bt} (m)	5.7	4.8	10.3	8.1	9.2	7.6	16.3
Ave. D_t (m)	9.9	10.3	6.5	8.1	7.9	7.4	7
Ave. H_t (m)	12.9	16.4	9.2	8.6	9	9.2	10.4
Tree species	Platanus	Ginkgo	Zelkova	Zelkova	Zelkova	Zelkova	Zelkova

Note: Nampodong: old city-center area, OC; Seomyeon: present city-center area, CC; Centum City: new city-center area, NC.

2.2.2. Scenarios Setting Based on Field Measurement Results

Mainly, the Taguchi method [60] is used to select an appropriate orthogonal array based on design parameters, including control factors and level values, obtain a large amount of data from the least number of experiments, and obtain the degree of influence through ANOVA [61]. This method finds extensive applications in engineering, biology, agriculture, and advertising.

For this study, the $L_{32} (4^9)$ orthogonal array was used to generate 32 different street canyon scenarios. Generally, an orthogonal array can select up to nine factors with four study parameters; however, only six factors with four parameters were selected for this study. The remaining three unused columns were left empty to verify the correlations between the factors. The selected factors, including the W_s , O_s , H_b/W_s , D_{bt} , D_t , and H_t , were set in an order, as listed in Table 2, based on field measurements and street landscape guidelines from other countries. In addition, the leaf area index is not considered. The level values of the simulation scenario runs were allocated in L_{32} , as presented in Table 3.

Table 2. Values of factor settings.

Factors		Level 1	Level 2	Level 3	Level 4
Street geometry	W_s	24 m	36 m	48 m	60 m
	O_s	NS	EW	NESW	SENW
	H_b/W_s	0.5	1.5	2.5	3.5
Tree configuration	D_{bt}	4 m	8 m	12 m	16 m
	D_t	5 m	7 m	9 m	11 m
	H_t	6 m	9 m	12 m	15 m

Table 3. $L_{32} (4^9)$ orthogonal array.

No.	O_s	W_s (m)	H_b/W_s	D_{bt} (m)	D_t (m)	H_t (m)	No.	O_s	W_s (m)	H_b/W_s	D_{bt} (m)	D_t (m)	H_t (m)
1	NS	24	0.5	4	5	6	17	NS	24	0.5	12	7	12
2	EW	24	1.5	8	7	9	18	EW	24	2.5	16	5	15
3	NESW	24	2.5	12	9	12	19	NESW	24	1.5	4	11	6
4	SENW	24	3.5	16	11	15	20	SENW	24	3.5	8	9	9
5	NS	36	1.5	12	9	12	21	NS	36	1.5	4	11	6
6	EW	36	0.5	16	11	15	22	EW	36	0.5	8	9	9
7	NESW	36	3.5	4	5	6	23	NESW	36	3.5	12	7	12
8	SENW	36	2.5	8	7	9	24	SENW	36	2.5	16	5	15
9	NS	48	2.5	8	5	9	25	NS	48	2.5	16	7	15

Table 3. Cont.

No.	O _s	W _s (m)	H _b /W _s	D _{bt} (m)	D _t (m)	H _t (m)	No.	O _s	W _s (m)	H _b /W _s	D _{bt} (m)	D _t (m)	H _t (m)
10	EW	48	3.5	4	7	6	26	EW	48	3.5	12	5	12
11	NESW	48	0.5	16	9	15	27	NESW	48	0.5	8	11	9
12	SESW	48	1.5	12	11	12	28	SESW	48	1.5	4	9	6
13	NS	60	3.5	16	9	15	29	NS	60	3.5	8	11	9
14	EW	60	2.5	12	11	12	30	EW	60	2.5	4	9	6
15	NESW	60	1.5	8	5	9	31	NESW	60	1.5	16	7	15
16	SESW	60	0.5	4	7	6	32	SESW	60	0.5	12	5	12

For this study, street canyon models were developed based on the street geometry and tree configuration feature characteristics of Busan for outdoor thermal simulation and analysis.

2.3. ENVI-Met Simulation

2.3.1. ENVI-Met Description

Developed by Bruse and Fler [62], ENVI-met is a widely used prognostic, three-dimensional model software based on CFDs and thermodynamics for modeling air, surface, and vegetation interactions and simulating turbulence, moisture, radiation fluxes, and microclimates in outdoor environments. The analytical model adopts Navier–Stokes equations for wind flow, atmospheric flow turbulence, energy and momentum, and boundary condition parameter calculations [63].

For this study, the model structure and mathematical equations of sub-models provided by Tsoka et al. [64] and Huttner [65] were considered. The high spatiotemporal resolution of ENVI-met provided more precise measurements of the TA, RH, WVLE, mean radiant temperature, and solar radiation, thereby providing a better understanding of microclimate effects on a street-level scale.

2.3.2. Basic Model Description

According to the field measurement results, most of the street lengths between the main intersections were approximately 150 m, with secondary or branch roads between the main intersections. As shown in Figure 2, the main model was sized at 280×280 m and the model height was twice the height of the highest building ($h = 2H_b$), where the street length was set to 154 m. The surrounding area (60–70 m) excluding the core model was set as a buffer zone, and five nesting grids were added outside the model to avoid interference from wind turbulence and unevenly distributed solar radiation accumulating near the street corner within the analysis area. On both sides of the street, 12 building units were set up, and trees were lined in two rows along the street to simplify the simulation. The street tree model was determined based on the field-measured street tree data. In different scenarios, as the H_t changed, the diameter at breast height and trunk height of the street trees were adjusted proportionally. Concrete was used for the building surfaces and sidewalks, while the surface material of the lanes between two rows of street trees comprised asphalt pavement to simulate the impermeable surfaces of the city. The surface material of the buffer zone comprised the same asphalt, whereas concrete was used for the remaining blocks.

Data collected from a height of 1.4 m above the ground were used as the output data. The analysis area was located in the pedestrian section between the facades of two middle building units and lanes. The average analysis area value in each scenario was considered for further data analysis. Data analysis mainly included the TA, WVLE, MRT, and PET. The PET was calculated using BIO-met, and the input parameters used default values.

The climatic conditions of Busan from 13 August to 14 August 2016, which were the hottest days of that summer, were selected for simulation to investigate the street geometry and tree configuration and configure an acceptable outdoor thermal environment. The results from 14 August 2016 were selected for analysis and to ensure a stable state for all components and obtain accurate results. The necessary input parameters for the ENVI-met

simulation are listed in Table 4, while the TA and RH data for full forcing in the simulation using data from the Busan meteorological station are listed in Table 5.

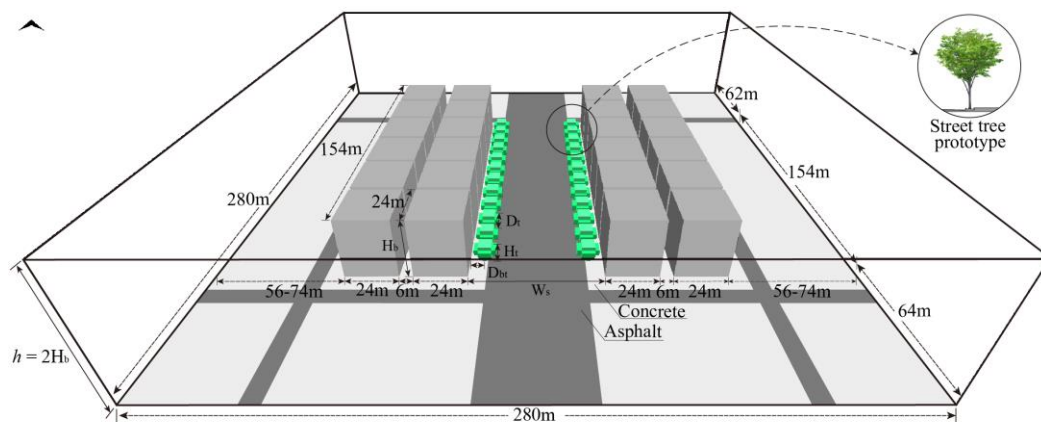


Figure 2. Geometry description.

Table 4. Initial settings of the ENVI-met simulation.

General Simulation Settings	Parameter
Location	Busan, South Korea: 35.05° N, 128.35° E
Simulation dates	13–14 August 2016
Nesting grids	5
Grid size	2 m × 2 m × 2 m
Initial wind speed	2.8 m/s
Wind direction (N = 0°, E = 90° ...)	200°
Roughness length	0.1
Lateral boundary conditions	Forced using TA and RH (Table 5)

Table 5. Weather data from the Busan meteorological station for 14 August 2016.

Time	0:00	1:00	2:00	3:00	4:00	5:00	6:00	7:00
TA (°C)	29.7	29.4	28.9	28.6	28.7	28.8	28.6	29.5
RH (%)	62.5	65.3	69.1	70.9	70.0	71.2	71.6	69.2
Time	8:00	9:00	10:00	11:00	12:00	13:00	14:00	15:00
TA (°C)	31.2	33.0	34.3	35.1	36.6	36.4	35.7	34.5
RH (%)	63.1	57.8	54.5	51.8	47.5	49.4	51.7	56.2
Time	16:00	17:00	18:00	19:00	20:00	21:00	22:00	23:00
TA (°C)	34.0	32.9	32.6	31.3	30.7	30.5	30.5	30.3
RH (%)	57.0	62.6	63.6	68.2	70.5	71.9	70.1	69.4

2.3.3. Simulation Verification

A portable weather station was set at 1.4–1.6 m above the pavement on a mobile cart to measure the log ambient TA, RH, and WVEL (Figure 3). The instrument parameters are listed in Table 6. Using the “Stop-and-Go” method [66], the mobile cart was moved as quickly as possible between monitoring points, where it was stationed at each point for 1 min, and recorded data after 1 min. This process was repeated for four monitoring points in each area during the measurement period.

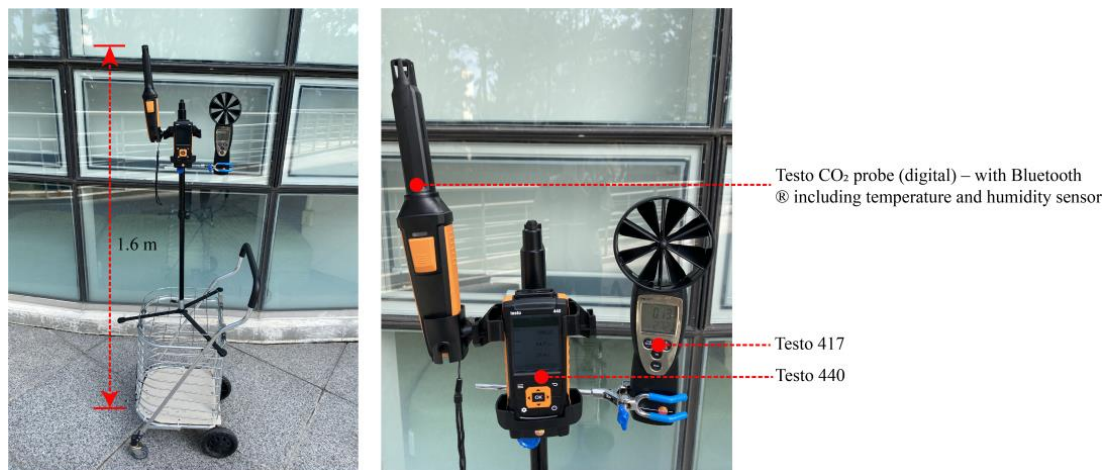


Figure 3. Mobile instrument settings (microclimate cart).

Table 6. Instrument accuracy used for field measurements.

Measurement Instruments	Parameter Measured	Accuracy
Testo CO ₂ probe (digital) with Bluetooth®, including a temperature and humidity sensor	TA	±0.5 °C
	RH	±3%RH (10 to 35%RH)
		±2%RH (35 to 65%RH)
		±3%RH (65 to 90%RH)
Testo 417	WVEL	±(0.1 m/s + 1.5% of mv)
Testo 440	Data logger	Logging interval: 1 s to 16 min

To confirm the simulation's accuracy, the main streets of Nampodong and Centum City were selected, and the measurement and simulation results were compared. The selected areas of Nampodong and Centum City were 260 × 160 m and 380 × 320 m, respectively. For the street geometry and tree configuration, we referred to OC3 and NC5 as the representative sites. Pavements in Nampodong mainly comprised asphalt and cement bricks, while those in Centum City used asphalt, granite bricks, and cement bricks. Table 7 shows the monitoring point locations in the verification area. Meteorological data from the ASOS were used to provide lateral boundary conditions for the simulation. Nampodong was close to the weather station, while Centum City was far away. Therefore, the validity of the weather station data used for this thermal environment research could be tested.

Field measurements were conducted in Centum City and Nampodong from 06:00 to 18:00 on 29 July 2022 and 6 August 2022, respectively. The TA and RH from the ASOS were simulated as full-forcing conditions, while WVEL and wind direction were determined from the average WVEL and dominant wind direction measured during 06:00–18:00. No or few clouds were observed during the measurement period. Details of the input data are presented in Table 8.

To ensure the same sheltering effect between the simulated and actual measurements, a fisheye lens was used to record the SVF values at the monitoring points; we then compared the measured and simulated SVF values, and revised the ENVI-met model (Table 9). After these adjustments, the SVF value calculated from the ENVI-met model was <10% of the measured value for all locations [11,67].

Table 7. Simplified model of the research area.


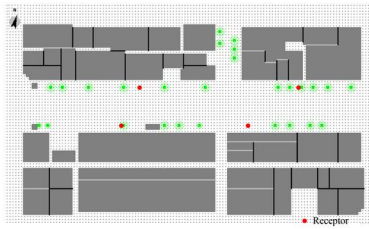






Site	Current Layout	ENVI-Met Model
Nampodong		
Centum City		





Table 8. Initial settings of the ENVI-met simulation for validation.

District	Nampodong	Centum City
Location in ENVI-met	Busan, South Korea: 35.05° N, 128.35° E	
Simulation dates	28~29 July 2022	05~06 August 2022
Analysis time	06:00~18:00, 29 July 2022	06:00~18:00, 06 August 2022
Nesting grids	5	
Grid size	2 m × 2 m × 2 m	
TA and RH	Meteorological data from ASOS	
Initial wind speed	3.6 m/s	2.6 m/s
Wind direction (N = 0°, E = 90°...)	180°	90°
Roughness length	0.1	0.1
Lateral boundary conditions	Full forcing	

Figure 4 shows the correlations between the simulated and measured TA and RH. They are depicted using two indexes, namely Pearson's r and the RMSE. Pearson's r is a statistical measure used to assess the degree of linear correlation between a simulated value and a measured value. The RMSE is employed as a standard index to quantify the deviation between the simulated value and the measured value. The simulation results for Nampodong and Centum City had strong correlations with the measured results. The Pearson's r of the TA and RH of Nampodong were 0.88 and 0.91, respectively, and the corresponding Pearson's r values for Centum City were 0.84 and 0.87, respectively; all of these exceed 0.8. The RMSE values for the TA and RH of Nampodong were 1.36 °C and 7.63%, respectively, and these RMSE values for Centum City were 1.18 °C and 5.98%, respectively. Furthermore, based on the field measurement results, the street trees were modeled using the same approach as that described in Section 2.3.2, demonstrating the reliability of applying the street tree model to real-world scenarios.

Table 9. Comparison of SVF_{real} and SVF_{model} results.

Nampodong	Point 1	Point 2	Point 3	Point-4
Fisheye image				
SVF _{real}	0.43	0.22	0.46	0.26
SVF _{model}	0.42	0.23	0.46	0.24

Centum City	Point 1	Point 2	Point 3	Point-4
Fisheye image				
SVF _{real}	0.13	0.40	0.44	0.14
SVF _{model}	0.15	0.38	0.49	0.16

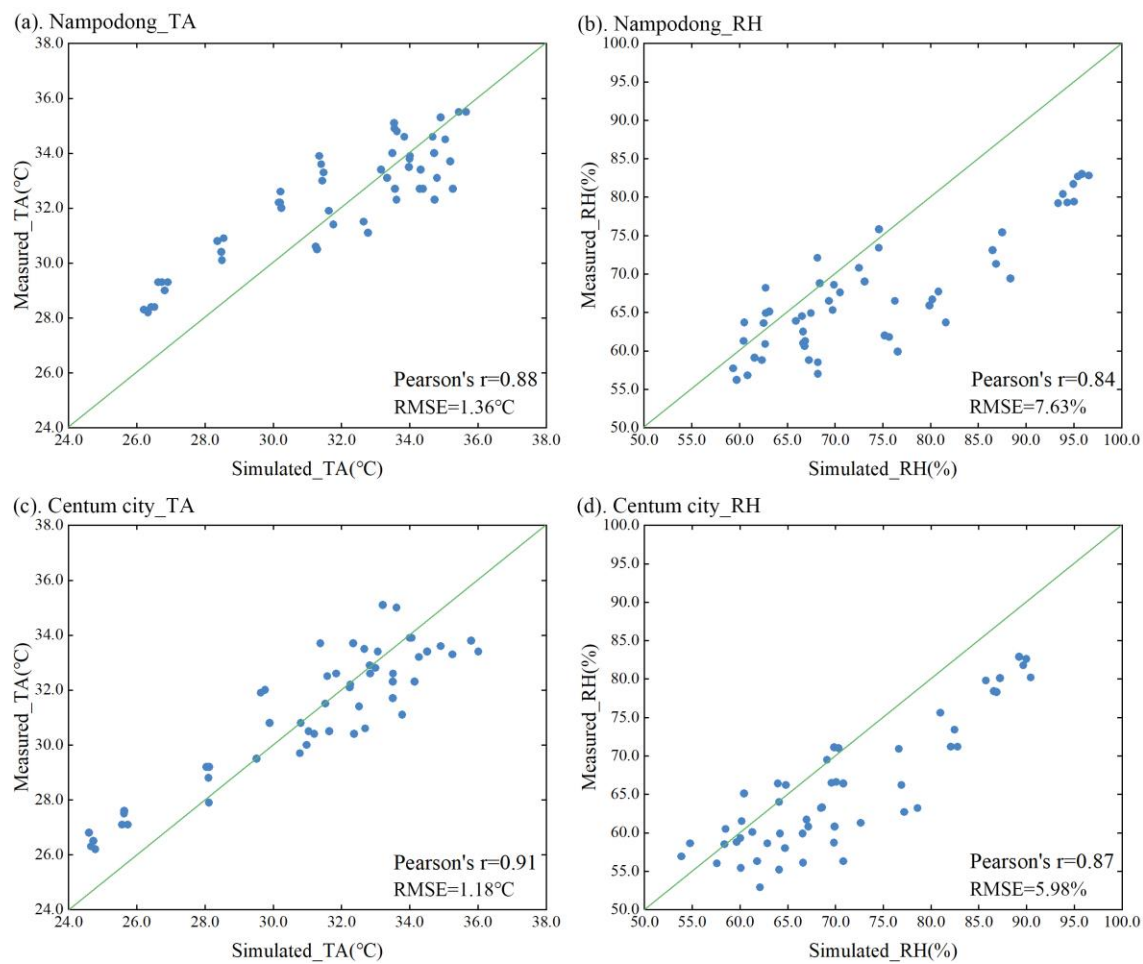


Figure 4. Validation of the simulated results and measured results.

In actual situations, the TA and RH were affected by complex parameters including cloud cover, wind direction, traffic flow, and heat released from machinery. Thus, the actual measured values fluctuated. The weather station was located in a mountainous area, north of Nampodong. As the surrounding plant coverage and RH were high, the simulated RH value was higher than the actual measured value. The measured TA was relatively higher than the simulated results. Thus, the selected street canyons were assumed to be on the main street, and the vehicle traffic volume had an impact on the TA. Additionally, considering measurement device errors (TA: ± 0.5 °C, RH: $\pm 3\%$), the difference between the actual measured and simulated values was within the allowable error range. Therefore, our simulations using ENVI-met were reliable.

2.4. GeoDetector

2.4.1. GeoDetector Description

Spatial heterogeneity refers to uneven distributions of traits, events, or their relationships across a region [68] or spatial variation in their attributes. The spatial heterogeneity between strata or areas, each comprising a number of units, is referred to as SSH [69].

Wang et al. developed GeoDetector as a new spatial analysis method to detect the interactions of two independent factors with a dependent factor [70]. Detailed explanations are available on the GeoDetector website (<http://www.geoDetector.cn/> accessed on 12 December 2023). GeoDetector can be used to separately calculate and compare the q -statistic of a single factor and that of two factors after overlap to determine occurrences of interactions between two factors, the strength and direction of these interactions, and their linearity or non-linearity. For this study, the q -statistic was used to measure the degree of stratified heterogeneity [69], as follows:

$$q = 1 - \frac{\sum_{h=1}^L \sum_{i=1}^{N_h} (Y_{hi} - \bar{Y}_h)^2}{\sum_{i=1}^N (Y_i - \bar{Y})^2} = 1 - \frac{\sum_{h=1}^L N_h \sigma_h^2}{N \sigma^2} = 1 - \frac{SSW}{SST}$$

where SSW denotes within the sum of squares; SST represents the total sum of squares; N and σ^2 denote the unit and population variances; and L denotes the number of strata ($h = 1, 2, 3, \dots, L$).

The q -statistic ranges from 0 to 1. The larger the q -statistic, the more obvious the stratified heterogeneity of Y . A q -statistic of “1” implies complete control over the spatial distribution of the dependent variable Y by the independent variable X , whereas a q -statistic of “0” indicates no relationship of the independent variable X with the dependent variable Y . The q -value indicates that X explains $q \times 100\%$ of the dependent variable Y .

2.4.2. Spatial Heterogeneity Scenario Settings

The Taguchi method was used to obtain the maximum information with the minimum number of experiments. However, considering the interactions between the factors greatly increased the number of experiments and weakened the advantages of the Taguchi method. This study considered 6 factors with a total of 32 scenarios. To evaluate the interactions between the factors, GeoDetector was introduced.

According to the GeoDetector modeling requirements, the selected 32 scenarios were arranged continuously and the factors were divided into 6 layouts. The impact of factor interactions on the TA, WVEL, and PET were analyzed. Similar to the ENVI-met model, the grid size was set to 2 m. In the 32 scenarios, excluding grids adjacent to building facades, the total number of grids was 5600 per stratum. An example of the factor layouts is presented in Figure 5.

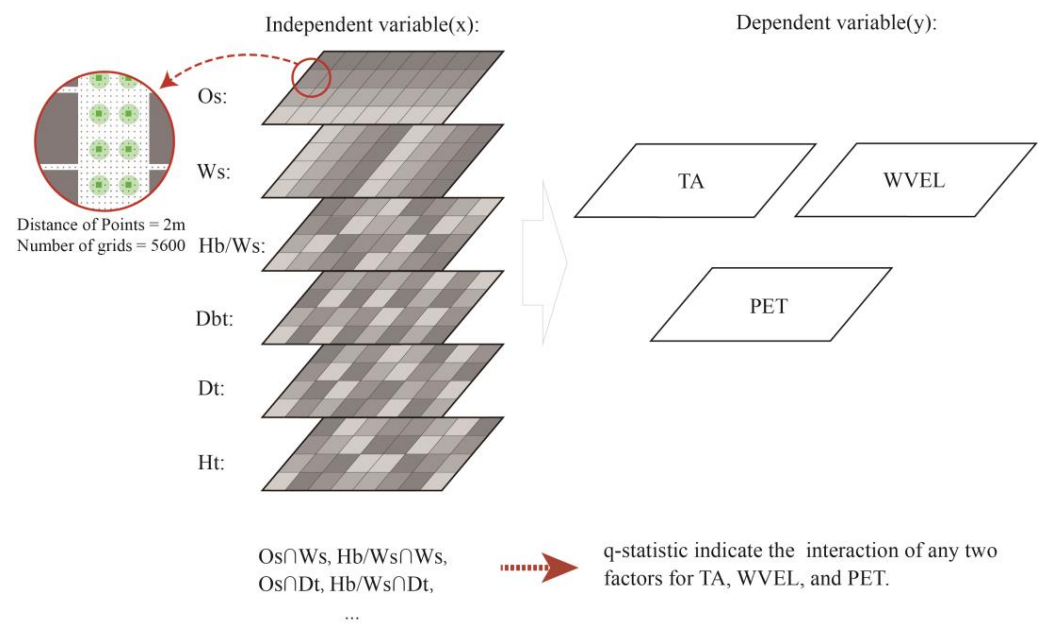


Figure 5. Spatial heterogeneity scenario description.

3. Results

3.1. Characteristics of the Outdoor Thermal Environment Indices from 08:00 to 18:00

An ANOVA was used to analyze the simulation results of the orthogonal experiments and determine the important effects of factors on the outdoor thermal environment. Considering the lack of solar radiation effects at night and in the morning, changes in the street geometry and tree configuration had less impact on the thermal environment. The selected time frame lasted from 08:00 to 18:00, and the study focused on analyzing data at 13:00, when the TA was the highest.

3.1.1. TA

The hourly changes in TA from 8:00 to 18:00 and the results of the ANOVA are shown in Figure 6 and Table 10. The values of O_s and H_b/W_s at all times and W_s after 11:00 were statistically significant ($p < 0.01$), indicating a strong correlation with the TA. The value of the TA for all factors was minimum at 08:00 and reached a peak at 13:00. The variation range before 13:00 was significantly greater than that after 13:00. At noon, solar radiation was strong, and the absorbed heat from buildings and the ground was released into the air through heat exchange. This had the strongest impact on the TA. Excluding the O_s , only slight differences in the change curves at 12:00 and 14:00, 11:00 and 16:00, and 10:00 and 17:00 were observed. The building shadow area increased with H_b/W_s , causing the TA to gradually decrease. Particularly, the difference between $H_b/W_s = 0.5$ and 1.5 was the most apparent. A similar phenomenon was demonstrated by Morakinyo and Lam [31]. The increase in TA before and after the time of a street's exposure to direct sunlight was higher than at other times (SENW was affected by direct sunlight from 10:00 to 12:00, and the change there was higher than that in other streets that were not exposed to direct sunlight). Compared with other O_s values, the NS street was affected by direct sunlight at 13:00, causing heating and resulting in the highest TA. Although the SENW street was already affected by direct sunlight, its WVLE was slightly higher than that of the EW streets (see Section 3.2.2), resulting in a lower TA for SENW due to the greater intensity of convective heat transfer taking away more heat. Additionally, the WVLE increased with the gradual increases in W_s , reducing the TA by enhancing the convective heat transfer intensity.

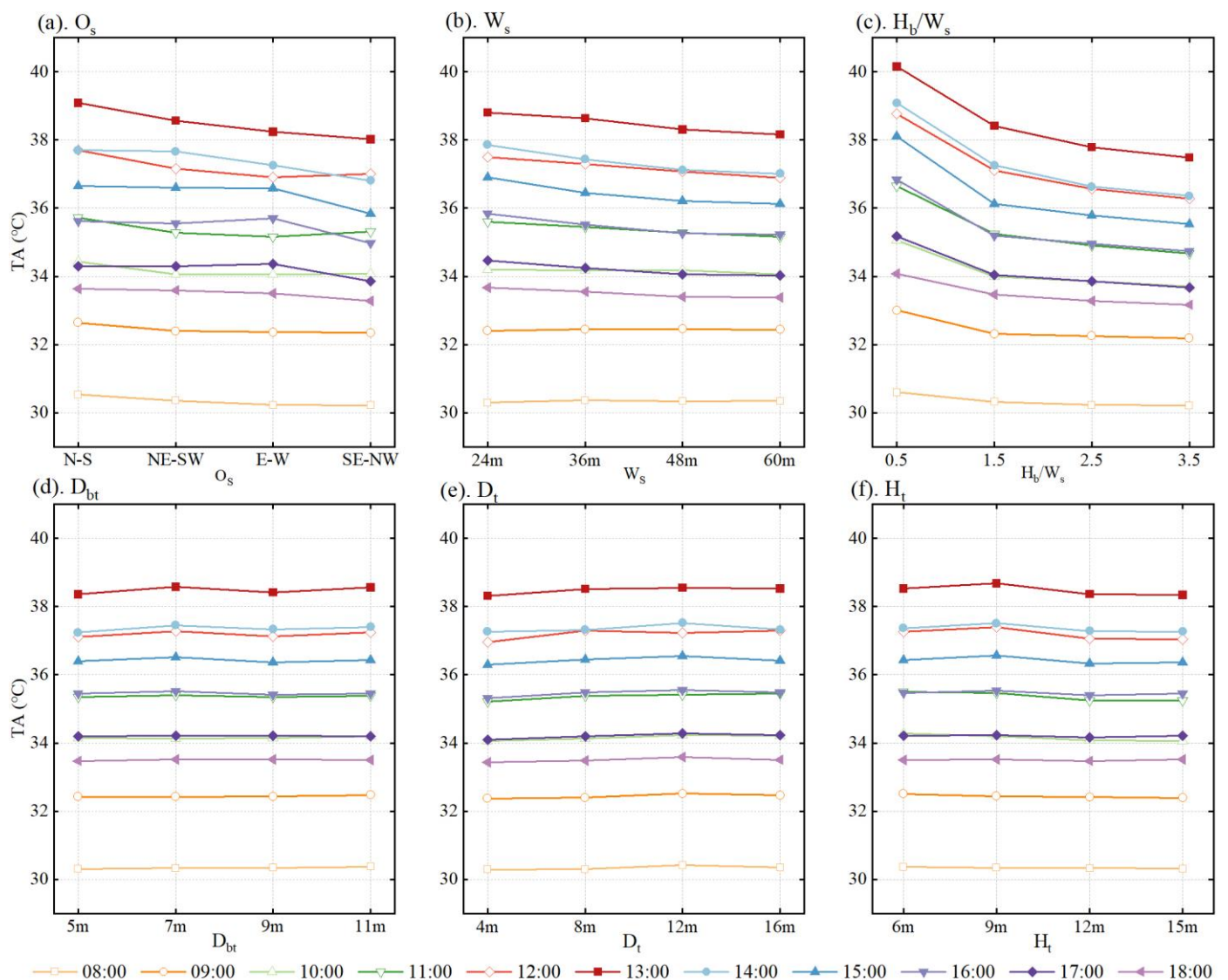


Figure 6. TA diagrams of different factors from 08:00 to 18:00.

Table 10. Results of significance tests for the TA from 08:00 to 18:00.

Factor	O_s		W_s		H_b/W_s		D_{bt}		D_t		H_t	
	F	p-Value	F	p-Value	F	p-Value	F	p-Value	F	p-Value	F	p-Value
8:00	24.795	0.000	1.010	0.428	39.262	0.000	0.723	0.561	4.194	0.037	0.638	0.608
9:00	21.185	0.000	0.676	0.586	163.524	0.000	0.313	0.816	5.896	0.014	3.516	0.057
10:00	26.570	0.000	3.103	0.076	300.111	0.000	0.270	0.845	7.038	0.008	11.970	0.001
11:00	10.566	0.002	6.828	0.009	144.112	0.000	0.312	0.816	4.064	0.040	5.645	0.016
12:00	11.177	0.002	6.650	0.010	123.280	0.000	0.480	0.703	4.876	0.024	4.944	0.023
13:00	27.973	0.000	12.258	0.001	200.661	0.000	0.645	0.604	4.751	0.026	6.111	0.012
14:00	26.168	0.000	25.321	0.000	263.025	0.000	0.744	0.550	4.096	0.039	4.561	0.029
15:00	38.915	0.000	31.189	0.000	349.979	0.000	1.962	0.184	5.675	0.016	5.170	0.021
16:00	45.142	0.000	29.800	0.000	342.313	0.000	2.129	0.160	7.508	0.006	2.982	0.083
17:00	26.008	0.000	17.997	0.000	205.829	0.000	0.772	0.536	5.116	0.021	0.944	0.456
18:00	15.415	0.000	12.365	0.001	108.858	0.000	0.338	0.799	4.131	0.038	0.447	0.725

The improvement effect of tree configuration on the TA was limited. Particularly, the D_t at all times and the H_t from 10:00 to 15:00 were statistically significant ($p < 0.05$). The results confirmed that smaller D_t and higher H_t values had stronger cooling effects. Similar results were reported in research on a shallow street canyon [31]. The statistical significance

and changing trend of D_{bt} were different from the results of Li et al. [11] due to different solar radiation and climatic conditions.

The differences between the maximum and minimum TA values at each time frame are shown in Figure 7. The maximum values of O_s and H_b/W_s both exceeded 1.0 °C, with H_b/W_s exceeding 1 °C for as long as 8 h and the maximum difference reaching 2.7 °C. Although the W_s was lower compared with the O_s and H_b/W_s , it was significantly higher than the three factors of tree configuration. Under heatwave conditions, the transpiration of the street trees became weak and the stomata on some leaf surfaces remained close, resulting in a relatively weak effect of changes on improving the TA. Yang and Lam [71] proved that the median value of the improvement in TA caused by ground greening was approximately 0.65 °C, and the maximum value did not exceed 1 °C.

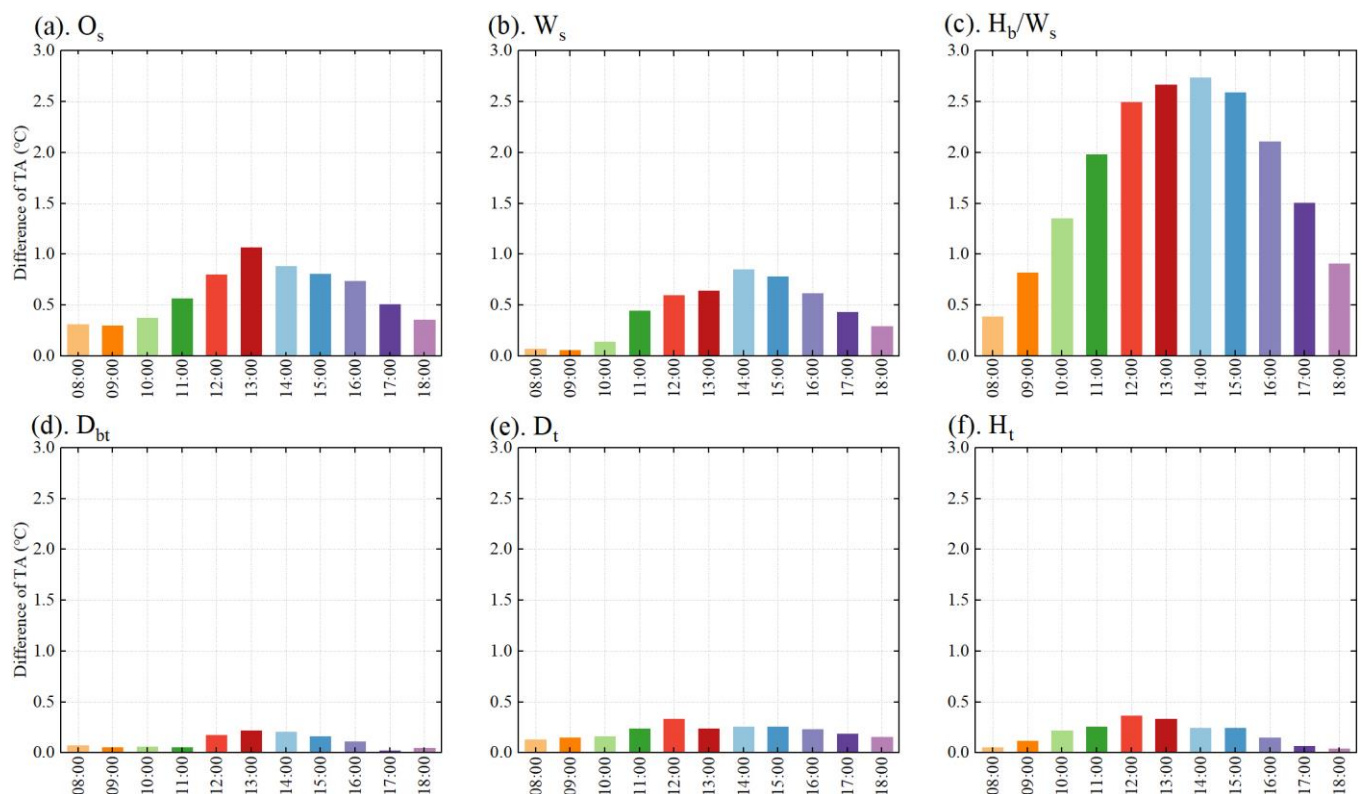


Figure 7. TA differences at different time periods from 08:00 to 18:00.

3.1.2. WVLE

The changes in WVLE from 8:00 to 18:00 are shown in Figure 8. Since the WVLE and wind direction were not forced, the changes in WVLE at different times and scenarios were small, with a maximum of no more than 0.2 m/s. Conversely, the WVLE change trends for different factors at different times were the same. Therefore, only the data at 13:00 (typical time) were analyzed for significance, and the differences in the impacts of factor changes on the WVLE were calculated (Table 11). Changes in O_s , W_s , and H_b/W_s had significant effects on the WVLE ($p < 0.01$), and all differences were of 0.5 m/s. The input wind direction was S-SW, and the angles between the wind direction and O_s were 20°, 25°, 70°, and 65° in sequence; the smaller the angle, the higher the WVLE. The larger the W_s , the smaller the resistance encountered by the wind flow when passing through the street, and the higher the WVLE. When H_b/W_s was < 1.5 , the street canyon had a significant acceleration effect on the WVLE. When H_b/W_s exceeded 1.5, the WVLE decreased initially and then increased owing to the effect of downward wind.

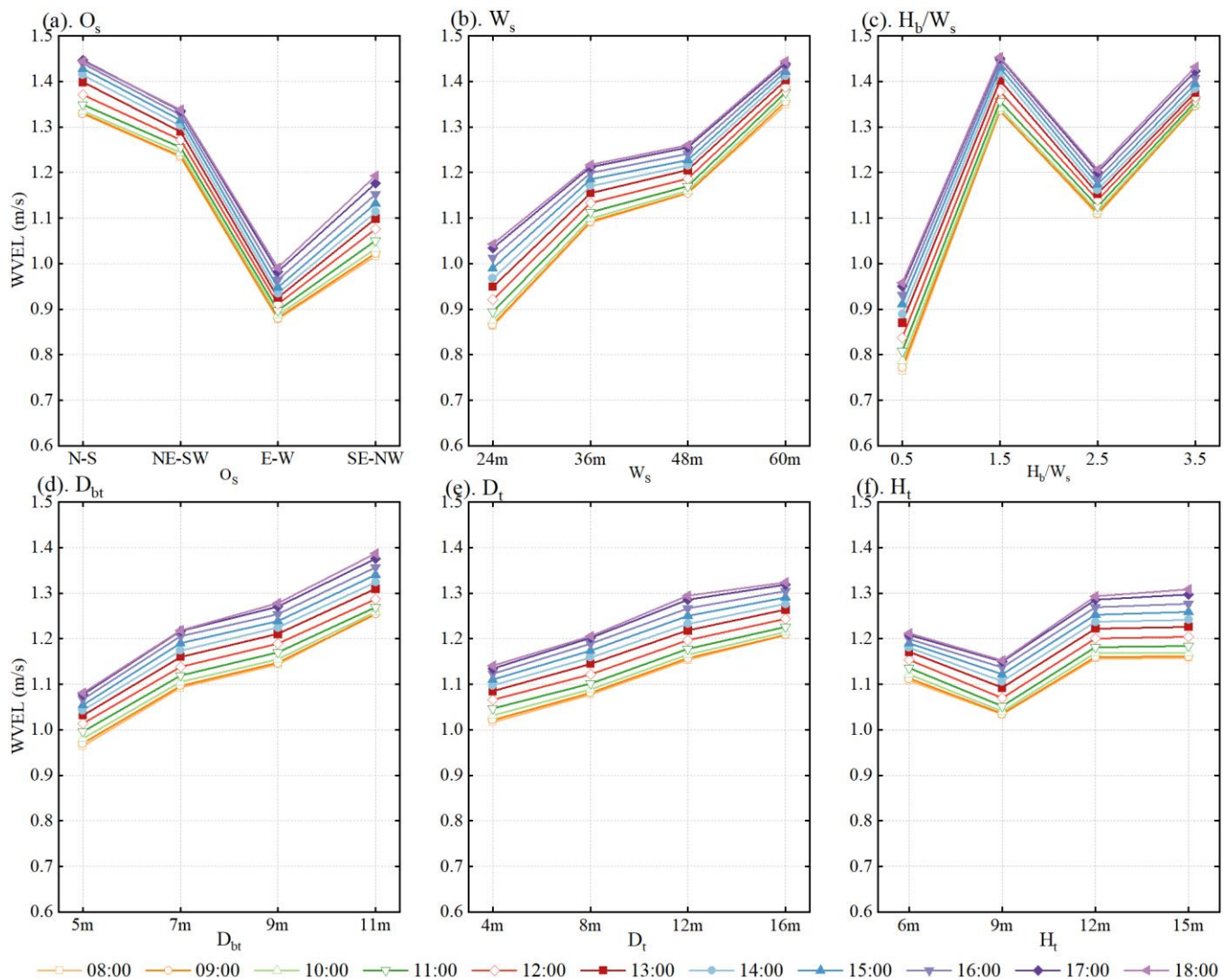


Figure 8. WVEL diagrams for different factors from 08:00 to 18:00.

Table 11. Results of difference and significance tests for the WVEL at 13:00.

Factor	Difference	F	<i>p</i> -Value
O_s	0.5	11.047	0.002
W_s	0.5	8.832	0.004
H_b/W_s	0.5	11.952	0.001
D_{bt}	0.3	3.416	0.061
D_t	0.2	1.306	0.326
H_t	0.1	1.045	0.414

Although the impact of tree configuration changes on the WVEL was not significant ($p > 0.05$), wind resistance decreased with the increase in D_{bt} , D_t , and H_t , thereby increasing the WVEL. Particularly, a linear growth was observed for both the D_{bt} and D_t . The increase in D_{bt} had a stronger effect, reaching 0.3 m/s, followed by the increases in D_t and H_t , which reached 0.2 and 0.1 m/s, respectively. Furthermore, when the H_t was 9 m, the WVEL suddenly dropped due to turbulence or composite interaction between factors that affected the simulation results; when the H_t exceeded 12 m, the amount of space under the tree canopies was higher, and the impact of changes in the H_t on the WVEL slowly reduced.

3.1.3. PET

The hourly results for the PET changes and ANOVA from 8:00 to 18:00 are shown in Figure 9 and Table 12. The impact of street geometry factors was statistically significant between 9:00 and 10:00 and between 12:00 and 16:00 ($p < 0.05$). Particularly, H_b/W_s was statistically significant ($p = 0.000$) at all times, indicating a significant impact of H_b/W_s . The PET value exceeded the “Very hot” standard of thermal sensitivity level during 12:00–15:00. The NS street reached the highest PET value at 14:00. The “Very hot” level of the EW street lasted 8 h, which was 2 h longer than the other orientations. The shadow of buildings reduced the PET, and radiation from the sun had a weak impact in the deep street canyons. $H_b/W_s = 0.5$ was greatly affected by solar radiation, and the PET rose the fastest, reaching its highest value at 13:00. From the perspective of the thermal sensitivity level, the duration of the “Very hot” level was 8 h, 5 h, 5 h, and 4 h, respectively. With the increase in W_s , the WVEL was enhanced, and more heat on the street was taken away to improve thermal comfort.

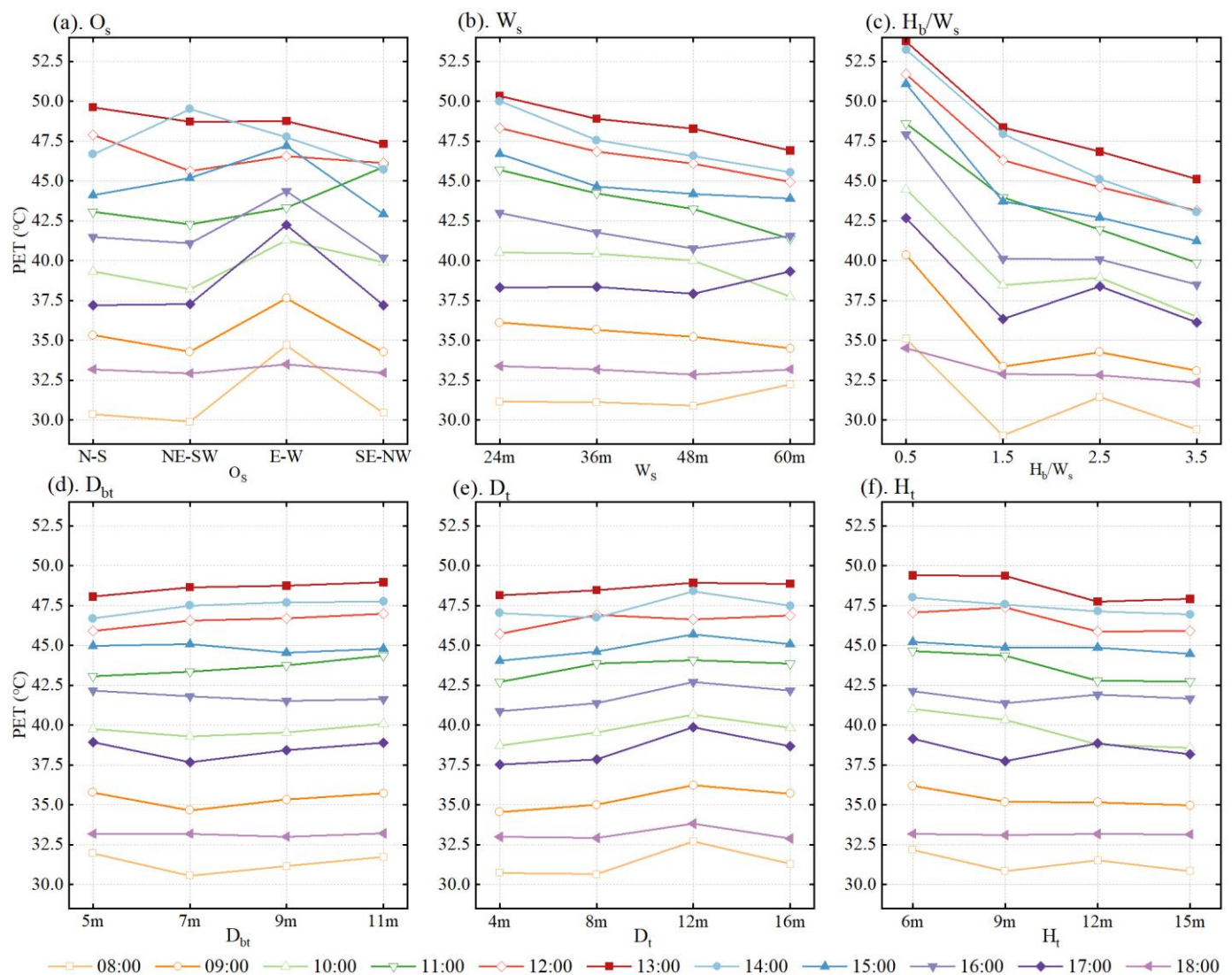


Figure 9. PET diagrams for different factors from 08:00 to 18:00.

Table 12. Results of significance tests for the PET from 08:00 to 18:00.

Factor	O _s		W _s		H _b /W _s		D _{bt}		D _t		H _t	
	F	p-Value	F	p-Value	F	p-Value	F	p-Value	F	p-Value	F	p-Value
8:00	30.648	0.000	2.357	0.133	43.061	0.000	2.589	0.111	5.843	0.014	2.329	0.136
9:00	21.240	0.000	3.838	0.046	91.971	0.000	2.235	0.147	5.033	0.022	3.083	0.077
10:00	7.748	0.006	7.362	0.007	50.425	0.000	0.427	0.738	3.270	0.067	6.711	0.009
11:00	3.201	0.071	3.747	0.049	16.722	0.000	0.077	0.971	0.887	0.481	1.841	0.203
12:00	4.633	0.028	7.316	0.007	52.581	0.000	0.086	0.966	2.470	0.122	3.542	0.056
13:00	10.075	0.002	20.460	0.000	146.193	0.000	0.183	0.905	3.727	0.049	11.930	0.001
14:00	16.795	0.000	27.143	0.000	147.296	0.000	0.414	0.747	5.959	0.013	4.907	0.024
15:00	22.193	0.000	9.095	0.003	113.378	0.000	1.220	0.353	5.026	0.022	2.336	0.135
16:00	20.728	0.000	4.800	0.025	100.720	0.000	1.286	0.332	5.186	0.020	1.293	0.330
17:00	23.720	0.000	1.433	0.291	31.960	0.000	1.375	0.306	4.334	0.034	1.613	0.248
18:00	1.832	0.205	1.253	0.342	21.962	0.000	0.230	0.874	4.789	0.026	0.081	0.969

Among the tree configuration factors, the D_t was significantly affected within 08:00–09:00 and 13:00–18:00, which had a significant impact on the PET ($p < 0.05$). The significance of the H_t at 10:00, 13:00, and 14:00 was maintained within 0.05, but its impact at 13:00 was the greatest ($p < 0.01$). Additionally, although the impact of the D_{bt} was not significant, it linearly increased. During 11:00–14:00, the value of $D_{bt} = 5$ m was reduced by a maximum of 1.3 °C. The overall trend of the research results for the D_{bt} and H_t in Yang et al.'s study [30] was similar to the results found in this study. When the D_t increased from 12 to 16 m, the PET value declined because the large distance reduced wind resistance and increased the WVEL. WVEL was one of the main factors that affected the PET. A smaller value of D_t and a larger value of H_t could cause the tree crowns to overlap, covering the streets from direct solar radiation, and reduce the PET at the pedestrian height.

The hourly differences between maximum and minimum values from 8:00 to 18:00 are shown in Figure 10. At 08:00, 11:00, 14:00, and 17:00, the change in PET was very large due to the direct sun exposure on the EW, SENW, and NESW streets. The PET value in all orientations was greatly enhanced due to the high solar elevation angle at noon, and the difference was decreased. At 14:00, the improvement of H_b/W_s was approximately 2.3 times that of the W_s , and the change between 08:00 and 17:00 was relatively large. Particularly, the impact of the change in H_b/W_s on the PET was largest at 14:00, with a maximum value of 10.2 °C. Considering changes in W_s , the variable levels of PET were 4.3 and 4.5 °C at 11:00 and 14:00. Additionally, in the morning, the trees blocked solar radiation through their canopies and reduced the PET value. At noon and in the afternoon, the canopies weakened the radiation capacity. Simultaneously, the canopies released a certain amount of longwave radiation, which further weakened the cooling effect.

3.2. Analysis of Interactions

For the spatial heterogeneity analysis, six factors were used, with each factor acting as an independent variable X and the evaluating indicator (including TA, WVEL, and PET) acting as the dependent variable Y. The q -statistic of any two factor interactions was greater than the sum of the q -statistic of two independent factors. Thus, the explanation of the evaluating indicator (Y) was enhanced. Furthermore, both the independent and dependent variables showed a non-linear enhancement trend. The TA, WVEL, and PET between 8:00 and 18:00 were analyzed.

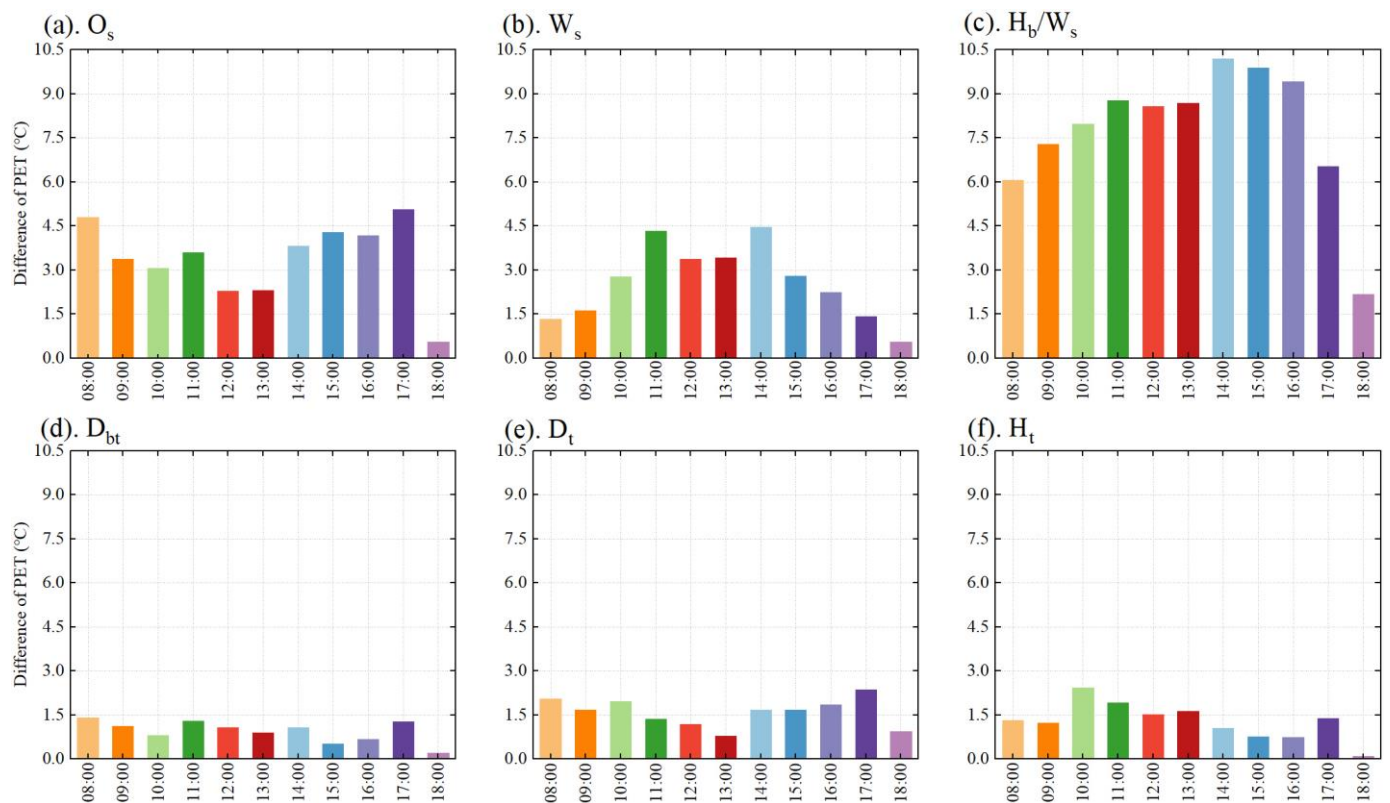


Figure 10. PET differences at different time periods from 08:00 to 18:00.

3.2.1. TA

The q -statistics regarding the impacts of interactions between two factors on the TA from 8:00 to 18:00 are shown in Figure 11. The q -statistics of $O_s \cap W_s$, $O_s \cap H_b/W_s$, and $W_s \cap H_b/W_s$ all reached 0.7 or more at 11:00, and reached their maximum values at 16:00 and 18:00, respectively. Thus, probabilities of 89.2%, 87.1%, and 89.1% were calculated for the TA being affected through interactions between the O_s and W_s , between the O_s and H_b/W_s , and between the W_s and H_b/W_s . Considering the interactions of street geometry factors and tree configuration factors, the interaction of H_b/W_s and tree configuration factors was always higher than that of the other two factors and tree configuration factors. Particularly, the interaction of H_b/W_s and tree configuration factors showed a higher probability (q -statistic ≥ 0.709) for the TA after 14:00, and the q -statistic of $H_b/W_s \cap H_t$ reached 0.803 at 18:00. The impact of $O_s \cap D_t$ on the TA between 13:00 and 18:00 gradually increased (q -statistic ≥ 0.614), and this q -statistic was less for $O_s \cap D_{bt}$ and $O_s \cap H_t$. Regarding the interactions of tree configuration factors, the q -statistics of $D_{bt} \cap H_t$ and $D_t \cap H_t$ were significantly higher than that of $D_{bt} \cap D_t$. Additionally, interactions between the same factors (such as $O_s \cap O_s$) represented a spatial autocorrelation of that factor. In this study, the q -statistic of H_b/W_s was between 0.347 and 0.745, showing a strong spatial autocorrelation.

3.2.2. WVEL

The q -statistics regarding the impacts of interactions between two factors on the WVEL from 8:00 to 18:00 are shown in Figure 12. In general, the interactions of all factors had a relatively low impact on the WVEL (q -statistic < 0.3).

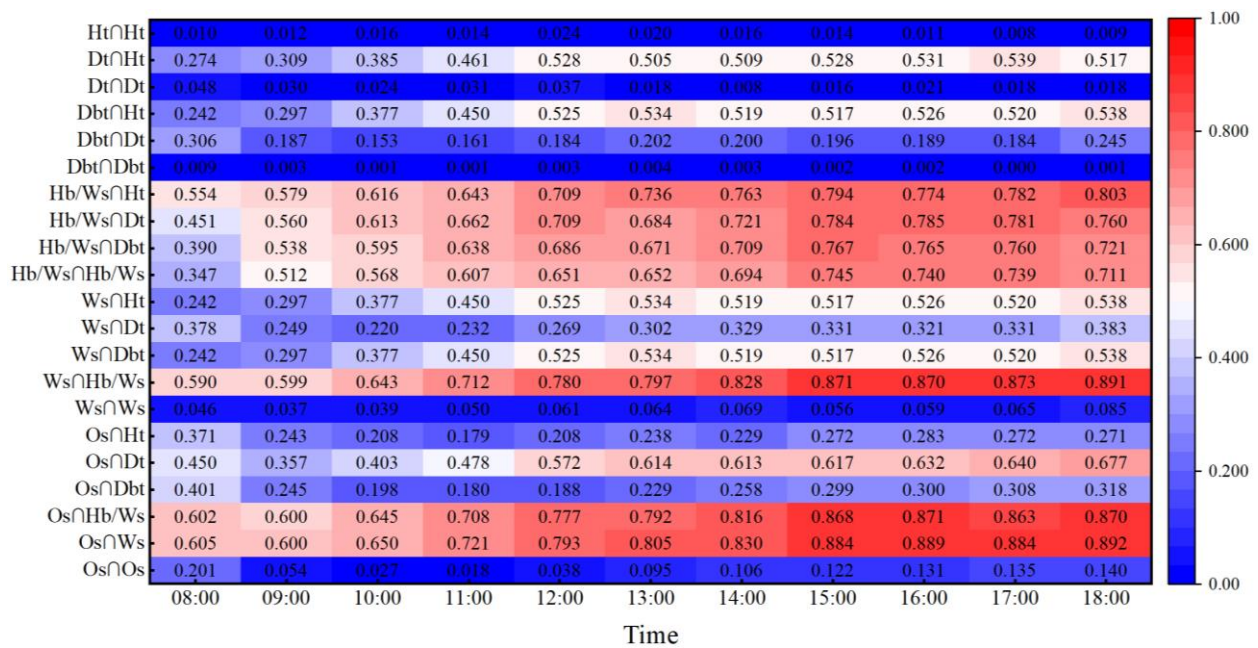


Figure 11. q -statistics for the TA according to interactions between factors from 08:00 to 18:00.

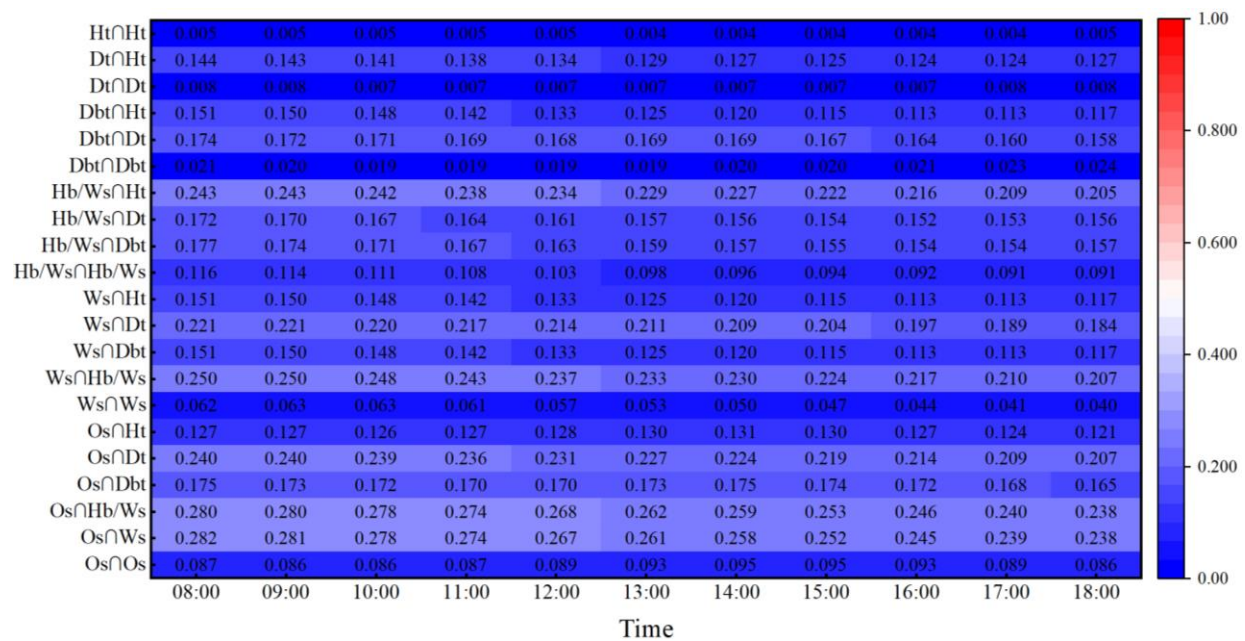


Figure 12. q -statistics for the WVLE according to interactions between factors from 08:00 to 18:00.

3.2.3. PET

The q -statistics regarding the impacts of interactions between two factors on the PET from 8:00 to 18:00 are shown in Figure 13. The q -statistic of the interaction between any two factors of street geometry was the highest. For example, the q -statistic distribution range during 11:00–16:00 was 0.645–0.783. The maximum value was attained at 14:00, where $O_s \cap W_s$, $O_s \cap H_b/W_s$, and $W_s \cap H_b/W_s$ were 0.782, 0.764, and 0.783, respectively. Considering the interactions of street geometry and tree configuration factors, H_b/W_s showed a leading role, and $H_b/W_s \cap D_t$ was as high as 0.588 at 14:00. Additionally, the interactions significantly affected the PET at noon and during the afternoon. The q -statistic distribution trend of interactions between the tree configuration factors was the same as the previous two aspects, but the q -statistic was relatively low.

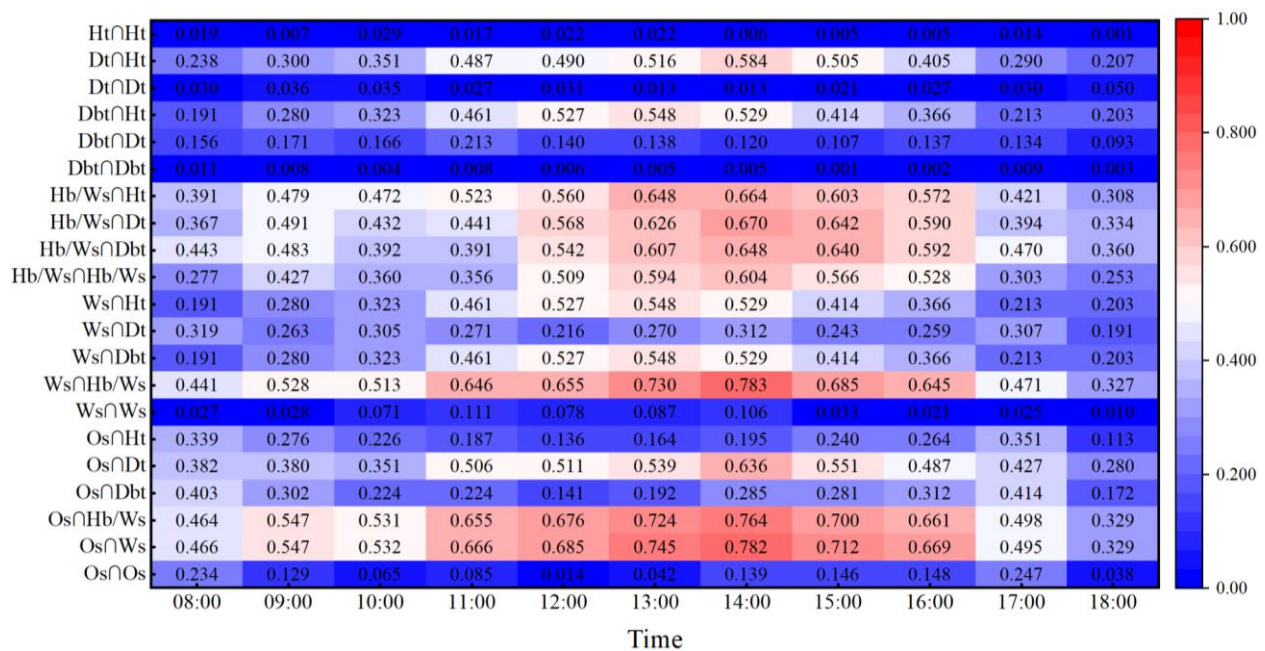


Figure 13. q -statistics for the PET based on interactions between factors from 08:00 to 18:00.

4. Discussion

The main aim behind the establishment of outdoor thermal environment models is to identify and improve solutions to existing problems [72]. When considering frequent heat-waves, a variety of factors should be combined to analyze the interactive relationship between factors. For example, to improve the wind environment [73], the main orientations [41], main building morphology [74], and landscape planning [75,76] should be studied.

In terms of street geometry, the effects of interactions between geometric factors on the outdoor thermal environment should be fully considered. Although a deep street canyon can prevent heat dissipation at night [77], the shelter from adjacent buildings during the day can prevent solar radiation from reaching the pedestrian area, improving comfort and reducing the importance of the tree configuration in the deep street canyon. Compared with other orientations, EW streets are exposed to solar radiation for longer durations. Andreou reported that the thermal comfort efficiency of H_b/W_s , which was increased for EW streets, was lower for NS streets [78]. At noon and in the afternoon, due to a high solar elevation angle and directly lit NS and NESW streets, the PET was significantly higher than that in the EW and SENW streets. Thus, the orientation of streets should be consistent with the wind direction in the city and wide enough to assist in air inflow and increase heat dissipation from the street canyon. Ventilation corridors can be merged with the main streets to arrange high-rise buildings along the streets. Each block should set up building setback lines to obtain enhanced W_s . Compared to scenarios without building setbacks, scenarios with building setbacks can increase the WVEL by 0.7 m/s at maximum [79]. Additionally, TA can be affected by the surrounding streets. Different streets can partially compensate a high TA in other streets [80]. When streets are arranged vertically in the direction of the wind, the vertical wind along the street length should be reduced by controlling the morphological parameters of the blocks and adjusting the geometry of the main streets and the surrounding building patterns. To avoid forming a stable canyon vortex, the average value of H_b/W_s should be <0.7 [18].

Shallow street canyons have high demands for shading, giving particular importance to the tree configuration. In terms of tree configuration, smaller D_t and larger H_t values offer solar radiation blocking and improve outdoor thermal comfort. However, the cost of mature trees is high. Thus, young trees that grow quickly and the development of temporary shade facilities in combination with these young trees can be implemented.

After the trees have matured, the temporary shade facilities can be demolished. Considering the interactions between D_t and H_t , densely staggered canopies should be avoided. In the low-WVEL scenario (initial WVEL = 0.7 m/s), there was a trend of the TA increasing when the H_t increased from 5 m to 11 m. The WVEL exhibited changes when the H_t increased from 5 m to 8 m, and the changes in WVEL became more gradual when the H_t exceeded 8 m, but the thermal comfort index was not analyzed in this study [81]. In this study, 12 m high trees showed more obvious improvements in thermal comfort, which may be attributed to the combined effect of the TA and WVEL. The value of D_{bt} in SENW streets can be appropriately increased to increase the WVEL and improve thermal comfort. In addition, each city has a unique type and combination of street trees, but cylindrical canopies can be more effective than spherical and conical canopies of the same height and diameter [82]. For trees with fruits such as ginkgo trees, a tree shaker can be introduced. A combination of street trees and shrubs can be implemented to reduce pollution in lanes and pedestrian areas on the streets with enough space [83].

This study demonstrates that during the process of urban regeneration, the layout of street trees should be considered as a crucial factor. The selection of the street tree species and configuration should be adapted to the characteristics of different neighborhoods to create a comfortable walking environment. In the development of new cities, building morphology and layout should be a key consideration. Urban planners can formulate design standards for neighborhood buildings that take into account multiple factors to create a pleasant outdoor thermal environment in cities.

This study used numerical simulation software to build an ideal urban street canyon, without considering transportation effects. Expanding the scale of research objects, combined with satellite images, numerical weather forecasting, and other methods, is necessary to study the outdoor thermal environment of cities under actual conditions.

5. Conclusions

This study measures street geometry and street tree configuration considering the Busan city center as an example, and typification analysis is performed. The Taguchi method is introduced to generate 32 typical scenarios, and a numerical simulation of the outdoor thermal environment is conducted through ENVI-met. An ANOVA is used to determine the importance of six factors in relation to the outdoor thermal environment. GeoDetector is introduced to assess interactions between the factors for spatial heterogeneity analysis. The main results are as follows:

- The impact of street geometry on the outdoor thermal environment is significantly higher than that of tree configuration factors. The impacts of street geometry and tree configuration are significantly higher at noon. The importance of street canyon factors in the improvement of outdoor thermal comfort in Busan is as follows: $H_b/W_s > O_s > W_s > D_t > H_t > D_{bt}$. Particularly, H_b/W_s has the most significant impact on the outdoor thermal environment. The higher the adjacent buildings, the greater the H_b/W_s near the ground-level buildings and street surface. By reducing solar radiation absorption and the release of heat, the TA, MRT, and PET can be reduced. Changes in H_b/W_s can reduce the “Very hot” level for up to 4 h.
- The SENW street is shadowed during the afternoon, effectively reducing the TA and solar radiation on the pedestrian area and offering relatively high thermal comfort. EW streets are directly exposed to the sun after sunrise and before sunset. Thus, MRT and PET values are the highest, and the “Hot” and “Very hot” periods are longer. Improvements to the outdoor thermal environment by improving tree configurations or implementing additional infrastructure are important.
- Shallow street canyons need additional greening to improve their outdoor thermal environment. The tree crowns absorb solar radiation in the morning and reach a saturation state. Thereafter, the decreased radiant heat and the heat from artificial surface reflections together affect the outdoor thermal environment around pedestrian areas at noon and in the afternoon. Smaller D_t and larger H_t values have a significant

impact on the outdoor thermal environment, but the impact of the tree settings on street wind resistance should be comprehensively considered. When the tree height is >12 m, the impact on the TA, MRT, and PET is reduced.

- The impact of interactions between any two factors of street geometry on the outdoor thermal environment is much higher than that of interactions between the street geometry and tree configuration factors, or that of interactions between tree configuration factors. Particularly, the interactions between two factors have a small impact on the WVEL, but have a greater impact on the TA, MRT, and PET. The impact of interactions between street geometry factors on the TA gradually strengthens over time, reaching its highest level (approximately 89%) at 18:00. The impact of interactions between H_b/W_s and tree configuration factors on the outdoor thermal environment indicators reaches its highest at 14:00 or 15:00. Additionally, H_b/W_s has a strong spatial autocorrelation with the TA.

This study provides significant insights for urban planners on how different street geometries and tree configurations can influence the outdoor thermal environment. Although none of these scenarios can reverse the long-term effects of global warming, rigorously applying various combinations of these strategies can moderate extreme climate events and accelerate the establishment of sustainable cities.

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Data Availability Statement: Data are available on request from the authors.

Conflicts of Interest: The authors declare no conflicts of interest.

Abbreviations

Cfa:	humid subtropical climate	SVF:	sky view factor
Cwa:	dry-winter humid subtropical climate	Pearson's r:	Pearson's correlation coefficient
ASOS:	automated surface observing system	RMSE:	root-mean-square error
W_s :	street width	TA:	air temperature
O_s :	street orientation	RH:	relative humidity
H_b/W_s :	the ratio of building height to street width	WVEL:	wind velocity
D_{bt} :	distance between buildings and trees	ANOVA:	analysis of variance
D_t :	planting distance	PET:	physiological equivalent temperature
H_t :	tree height	SSH:	spatial stratified heterogeneity

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