



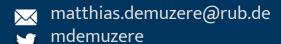


A global map of Local Climate Zones

to support earth system modelling and urban scale environmental science

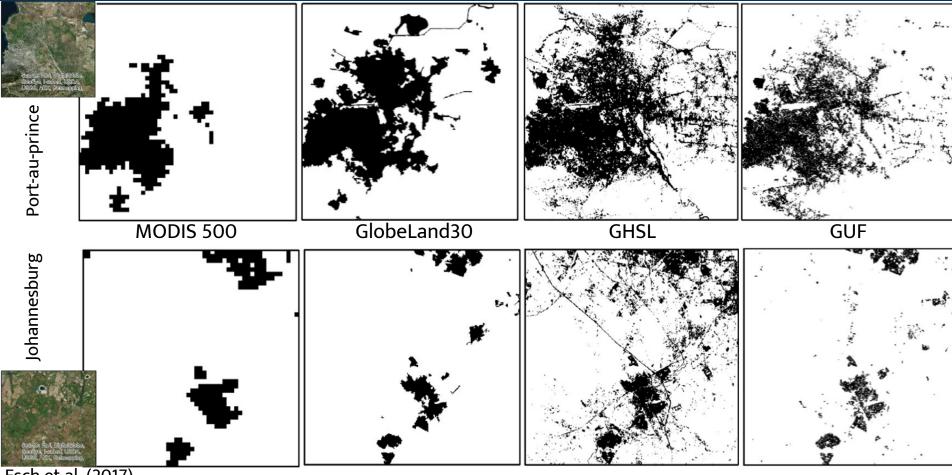
Matthias Demuzere

Benjamin bechtel Jonas Kittner & many more





Context



Esch et al. (2017)



WUDAPT

An Urban Weather, Climate, and Environmental Modeling Infrastructure for the Anthropocene

J. Ching, G. Mills, B. Bechtel, L. See, J. Feddema, X. Wang, C. Ren, O. Brousse, A. Martilli, M. Neophytou, P. Mouzourides, I. Stewart, A. Hanna, E. Ng, M. Foley, P. Alexander, D. Aliaga, D. Niyogi, A. Shreevastava, P. Bhalachandran, V. Masson, J. Hidalgo, J. Fung, M. Andrade, A. Baklanov, W. Dai, G. Milcinski, M. Demuzere, N. Brunsell, M. Pesaresi, S. Miao, Q. Mu, F. Chen, and N. Theeuwes

world Urban Database and Access Portal Tools

WUDAPT is an international community-generated urban canopy information and modeling infrastructure to facilitate urban-focused climate, weather, air quality, and energy-use modeling application studies

Ching et al. (2018)

WUDAPT?

WUDAPT Levels 0, 1 & 2 features and their potential applications.

Product	Level 0	Level 1	Level 2	
Coverage	Over 120 cities and regions	Data gathering methods; and testing to refine Level 0 based on crowdsourcing APPS and Buidling Typology approaches as in MApUCE	Any city by using our new 3-D mapping technology, DSC	
Data source	Landsat + Google Earth + local data & expert evaluation	Landsat + Google Earth + local data & expert evaluation	World-view Stereo Data + Terra- SAR data	
Resolution	100–500 m	100–500 m	2 m	
Format	kml, tiff	GIS shapefiles	GIS shapefiles	
Applications	Environment and Energy (Weather Research and Forecasting (WRF) Modeling, Urban heat island) Urban and Regional planning (population density)	Environment and Energy (weather and climate, urban air flows, urban radiation, mean radiant temperature, urban energy consumption, air pollution, CO2 and GHG emission) Ecology (biodiversity) Urban and Regional planning (master plan, land use plan, green master plan, new town plan)	Environment and Energy (building energy cost) Building and community design (visibility analysis, building development) Disaster and risk management (Flooding, heatwave) Pedestrian and citizen's mobility (walkability, thermal comfort) Public health (polluted areas)	

Ching et al. (2019)

WUDAPT?

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	Modeling, Urban heat island)	energy consumption, air pollution, CO2 and GHG emission)	Building and community design	
	Urban and Regional planning	Ecology (biodiversity)	(visibility analysis, building	
	(population density)	Urban and Regional planning (master plan, land use plan,	development)	
	(F - F	green master plan, new town plan)	Disaster and risk management	
			(Flooding, heatwave)	
			Pedestrian and citizen's mobility	
			(walkability, thermal comfort)	
	Local Climate Zone maps		Public health (polluted areas)	

Ching et al. (2019)

Local Climate Zones (LCZs)?

Built types

Compact highrise

Dense mix of tall buildings to tens of stories. Few or no trees. Land cover mostly paved. Concrete, steel, stone, and glass construction materials.

Land cover types



Heavily wooded landscape of deciduous and/or evergreen trees. Land cover mostly pervious (low plants). Zone function is natural forest, tree cultivation or urban park



Scattered trees



Lightly wooded landscape of deciduous and/or evergreen trees. Land cover mostly pervious (low plants). Zone function is natural forest, tree cultivation, or urban park.

Compact lowrise



Dense mix of lowrise buildings (1-3 stories). Few or no trees. Land cover mostly paved. Stone,

Bush, scrub



Open arrangement of tall buildings to tens of stories. Abundance of pervious land cover (low

Low plants



Featureless landscape of grass or herbaceous plants/crops. Few or no trees. Zone function is natural grassland, agriculture, or urban park.

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Bare rock or paved



Featureless landscape of rock or paved cover ew or no trees or plants. Zone function is natural desert (rock) or urban transportation.

Open lowrise



Open arrangement of lowrise buildings (1-3 stories). Abundance of pervious land cover (low plants, scattered trees), Wood, brick, stone, tile, and concrete construction materials.

Bare soil or sand



Featureless landscape of soil or sand cover. Few or no trees or plants. Zone function is natural desert or agriculture.

Lightweight lowrise



Dense mix of single-story buildings. Few or no trees. Land cover mostly hard-packed. Lightweight construction materials (e.g., wood, thatch, corrugated metal).





Open arrangement of large lowrise buildings (1-3 stories). Few or no trees. Land cover mostly payed. Steel, concrete, metal, and stone

VARIABLE LAND COVER PROPERTIES

Variable or ephemeral land cover properties that change significantly with synoptic weather patterns, agricultural practices, and/or seasonal cycles.

b. bare trees

sky view factor. Reduced albedo.

Sparsely built



Sparse arrangement of small or medium-sized buildings in a natural setting. Abundance of pervious land cover (low plants, scattered trees).

s, snow cover

Parched soil. Low admittance, Large Bowen ratio. Increased albedo.



Lowrise and midrise industrial structures ers, tanks, stacks). Few or no trees. Land er mostly payed or hard-packed. Metal, steel, d concrete construction materials.

Leafless deciduous trees (e.g., winter). Increased

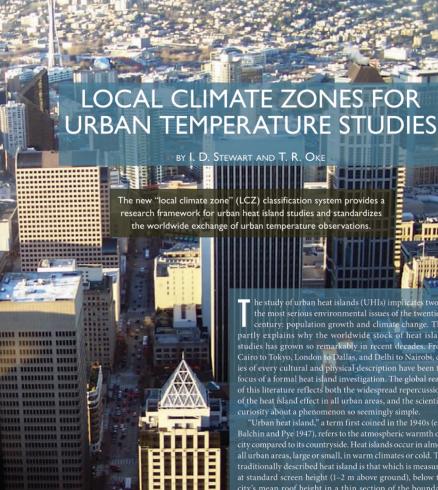
Snow cover >10 cm in depth. Low admittance.

d. dry ground

w. wet ground

Waterlogged soil, High admittance, Small Bowen ratio. Reduced albedo.



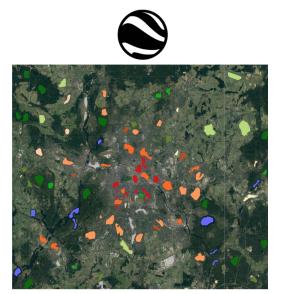


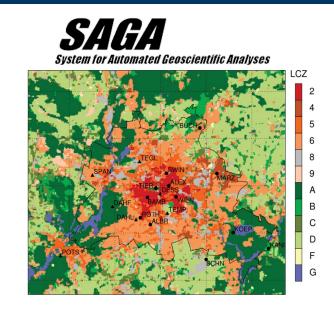
he study of urban heat islands (UHIs) implicates two of the most serious environmental issues of the twentieth century: population growth and climate change. This partly explains why the worldwide stock of heat island studies has grown so remarkably in recent decades. From Cairo to Tokyo, London to Dallas, and Delhi to Nairobi, cities of every cultural and physical description have been the focus of a formal heat island investigation. The global reach of this literature reflects both the widespread repercussions of the heat island effect in all urban areas, and the scientific curiosity about a phenomenon so seemingly simple. "Urban heat island," a term first coined in the 1940s (e.g., Balchin and Pye 1947), refers to the atmospheric warmth of a city compared to its countryside. Heat islands occur in almost all urban areas, large or small, in warm climates or cold. The traditionally described heat island is that which is measured

at standard screen height (1-2 m above ground), below the city's mean roof height in a thin section of the boundary.

LCZ maps?

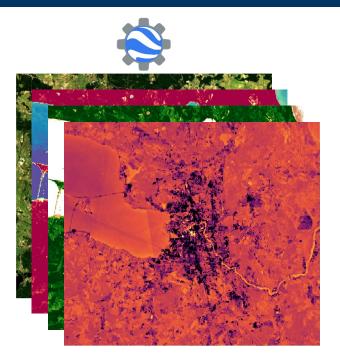


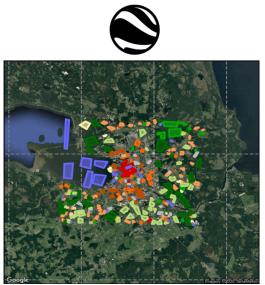


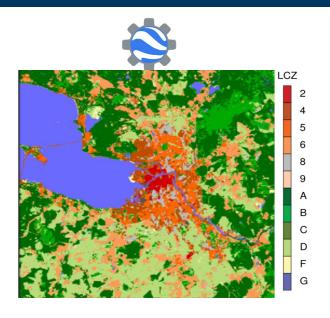


- This method is universal, simple and objective
- It requires the download of large satellite images, and lacks an automated quality control and sufficient resources to keep dissemination up-to-date

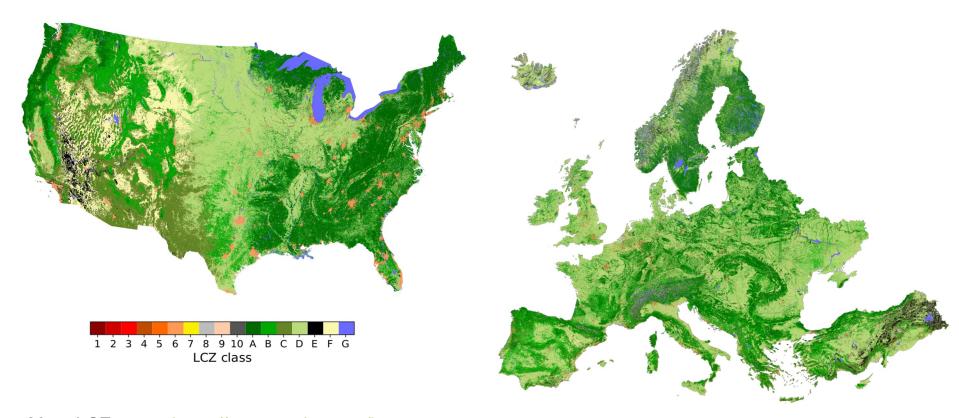
LCZ maps in the cloud







Continental-scale LCZ maps



More LCZ maps: https://www.wudapt.org/lcz-maps/

Demuzere et al. (2019b, 2020)

LCZ database?

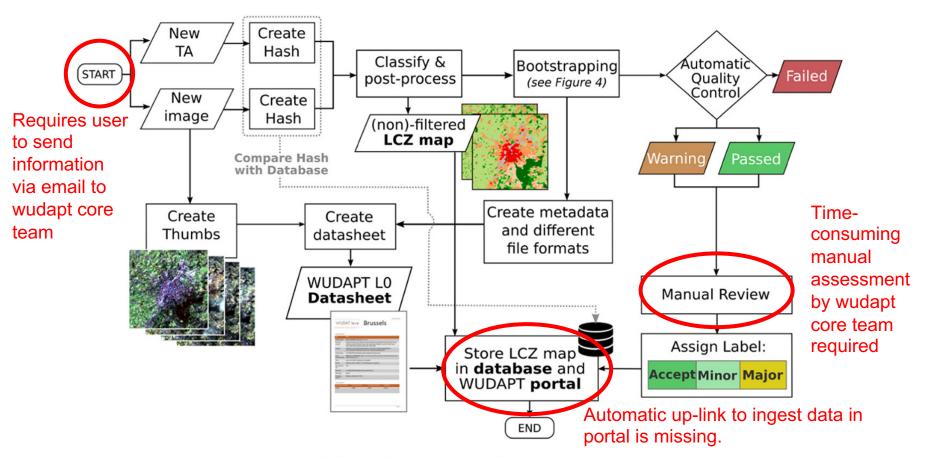


Fig. 2. The LCZ production and quality assessment workflow.

Bechtel et al. (2019a)

LCZ Generator https://icz-

generator.rub.de/

User input

LCZ classification & quality control

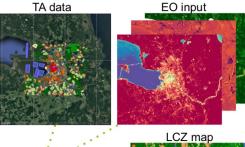
Output

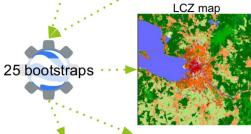
1. Personal information

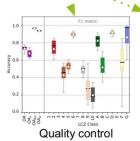
- First Name
- Last Name
- E-mail Address

2. Training area information

- Continent
- Country
- City Name
- Upload training area file
- Representative Date
- Reference
- Remarks









Suspicious TAs

1. Compressed results (e-mail)

- Factsheet
- LCZ map
- QGIS/ArcGIS colormaps

data/

- ID.kml
- ID_TA_statistics.csv
- ID_auto_qc_polygon.shp
- ID_auto_qc_point.shp
- ID_cm_average_formatted.csv

figures/

- ta_freq.png
- lcz_map.jpg
- lcz_oa.jpg

2. Online submission table

Improve training area data

Demuzere et al. (2021)

generator.rub.de/

J CZ Generator

Hom

Training area submission Available I C7 mans FA



Welcome to the LCZ Generator!

Fast and easy Local Climate Zone mapping

Getting started:

- 1. Read Demuzere et al. (2021) it serves as the primary user guide
- 2. Download the Training Area Template kml file
- 3. Create your Training Areas following the guidelines
- 4. Once finished, use the submission form to submit your file.
- 5. Fill out the fields in the submission form; fields with an asterisk (*) are required.
 - ▶ Show detailed information
- 6. Submit the form. If you see a green box appear on the top of the page after clicking the submit button, your submission was successful and will be processed. If a red box appears, there was a problem with your Training Area file. Check out the FAQ for more information.
- 7. You will be notified via email once the processing has finished. Depending on the current load of the system it should take ~20 minutes.
- 8. After you received the email, your submission is also available in the submission table.

Submit your Training Area

Show generated LCZ maps

Please cite the tool using:

Privacy Note

Demuzere, M., Kittner, J., Bechtel, B. (2021). LCZ Generator: a web application to create Local Climate Zone maps. Frontiers in Environmental Science 9:637455. https://doi.org/10.3389/fenvs.2021.637455

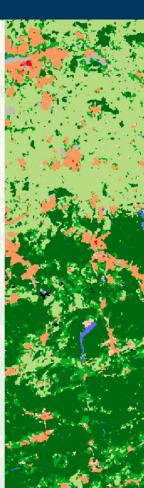
Terms of Service





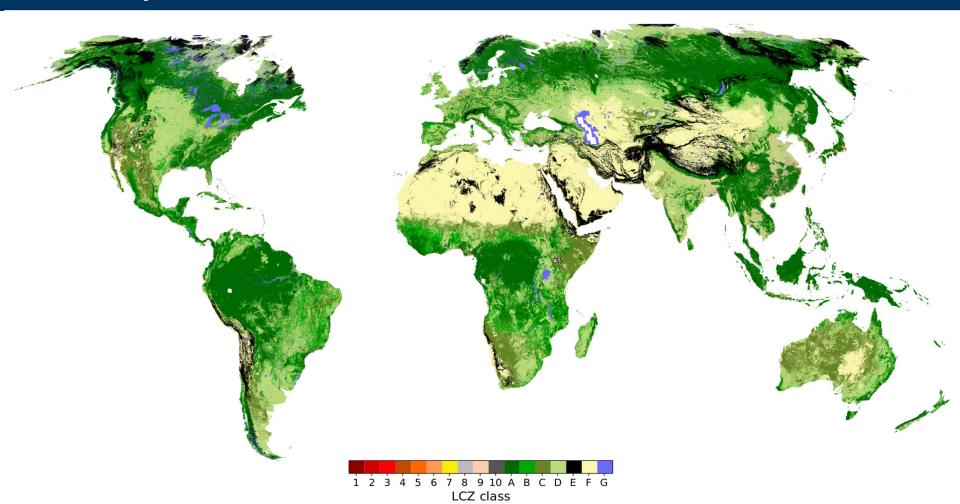






LCZ Generator nttps://iczgenerator.rub.de/ LCZ Generator Home Training area submission Available LCZ maps FAQ **Download Selected** Search: Show best submissions Date City Country Continent Submitted Author Accuracy 1 Barcelona 2022-06-08 Majdi Hunter-Batal 0.69 Spain, Kingdom of Europe **Show Factsheet** 07:26:11 NANJING 0.81 China, People's Republic 2022-06-08 Yokey Tang Asia **Show Factsheet** 00:26:51 Salt Lake City United States of America North 2022-06-07 **Natalie White** 0.52 **Show Factsheet** 17:53:05 America SÃO PAULO Brazil, Federative 2022-06-07 Sara Lopes De Moraes 0.65 South Show Factsheet 14:42:41 Republic of America Piatra Neamt Romania 2022-06-07 Dragos Butnaru 0.70 Europe Show Factsheet 11:58:14 India, Republic of Asia 2022-06-07 0.43 Bhubaneswar **Show Factsheet** 11:40:03 São Paulo Sara Lopes De Moraes 0.65 Brazil, Federative South 2022-06-07 Show Factsheet Republic of America 11:00:13 nanjing China, People's Republic Asia 2022-06-07 Yokey Tang 0.82 **Show Factsheet** 01:53:29 São Paulo Brazil, Federative 2022-06-06 0.65 South Sara Lopes De Moraes **Show Factsheet** Republic of America 16:31:53 Yazd Iran, Islamic Republic of 2022-06-06 0.69 Asia **Show Factsheet** 15:48:24 218 Next Last Previous Showing 1 to 10 of 2,175 entries

Global map of LCZs



LCZ maps ~ climate modelling?

Table: LCZ-class specific urban canopy parameter values

LCZ	λ_B	λ_I	λ_V	Н	SVF	AHF	IMD
1. Compact high-rise	40-60	40-60	<10	>25	0.2-0.4	50-300	>80
2. Compact midrise	40-70	30-50	<20	10-25	0.3-0.6	<75	>70
3. Compact low-rise	40-70	20-50	<30	3–10	0.2-0.6	<75	>60
4. Open high-rise	20-40	30-40	30-40	>25	0.5-0.7	< 50	50-80
5. Open midrise	20-40	30-50	20-40	10-25	0.5-0.8	<25	50-80
6. Open low-rise	20-40	20-50	30-60	3–10	0.6-0.9	<25	40-90
7. Lightweight low-rise	60-90	<20	<30	2-4	0.2-0.5	<35	>60
8. Large low-rise	30-50	40-50	<20	3–10	>0.7	< 50	>70
9. Sparsely built	10-20	<20	60-80	3–10	>0.8	<10	10-40
10. Heavy industry	20-30	20-40	40-50	5–15	0.6-0.9	>300	>40
A. Dense trees	<10	<10	>90	3-30	< 0.4	0	<20
B. Scattered trees	<10	<10	>90	3–15	0.5-0.8	0	<20
C. Bush, scrub	<10	<10	>90	<2	0.7-0.9	0	<20
D. Low plants	<10	<10	>90	<1	>0.9	0	<20
E. Bare rock or paved	<10	>90	<10	< 0.25	>0.9	0	>90
F. Bare soil or sand	<10	<10	>90	< 0.25	>0.9	0	<20
G. Water	<10	<10	>90	_	>0.9	0	<20

⁺ Radiative and thermal properties such as emissivity, albedo, heat capacity, heat conductivity etc ...

Stewart & Oke (2012); Demuzere et al. (2019a, 2022)

LCZ maps ~ climate modelling?

Table: LCZ-class specific urban canopy parameter values

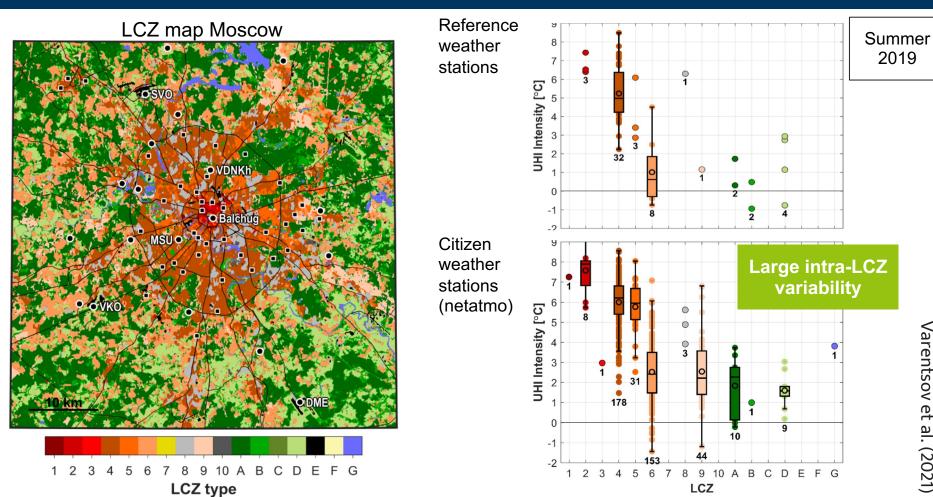
3. Compact low-rise	40-70	20-50	<30	3-10	0.2-0.6	<75	>60
5. Ope i e							
6. Open The glo	bal LCZ ma	n describe	es all the	cities of t	he world		
7. Lightweight low-rise	60-90	< 20		2-4	0.2-0.5		
8. Large low-rise in the s	ame, unive	rsal langu	age,20				
9. Sparsely built hut inte	erested use	rs can rea	d it in the	eir own di	ialect		
10. Heavy industry	20-30	20-40	40-50	5-15	0.6-0.9		
D. Low plants	<10	<10	>00	-1	>0.0	0	-20

⁺ Radiative and thermal properties such as emissivity, albedo, heat capacity, heat conductivity etc ...

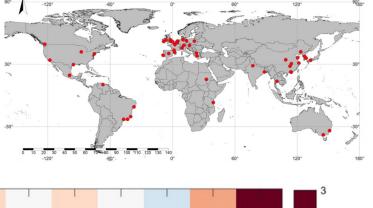
Applications

Air temperature

Varentsov et al. (2021)



The LCZ approach provides a consistent and comprehensive framework for SUHI analysis.



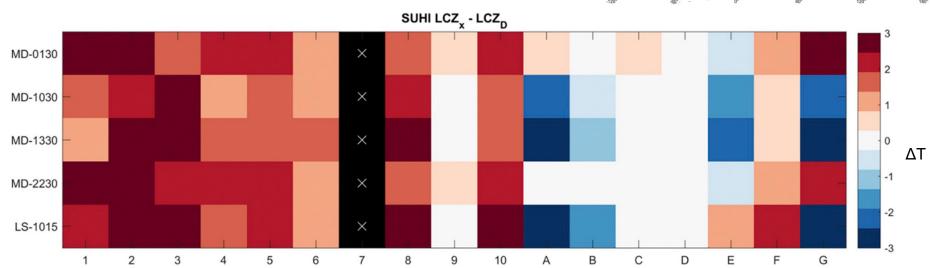


Fig. 11. Average SUHI intensity in K for all cities and LCZ compared to LCZ D for different acquisition times and sensors. Black with white x (LCZ 7) indicates that the LCZ type is not present in the study.

Bechtel et al. (2019b)

Applications

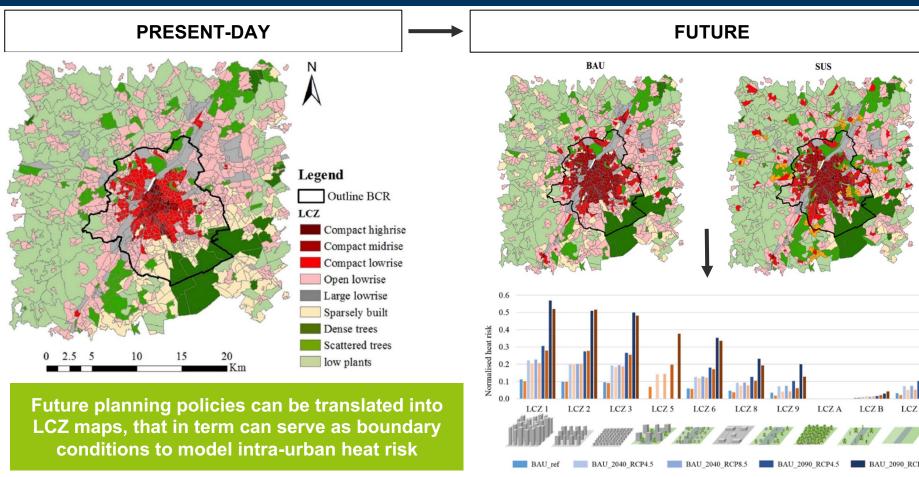
Urbanisation - Future heat risk

SUS

LCZ A

SUS_2040_RCP8.5

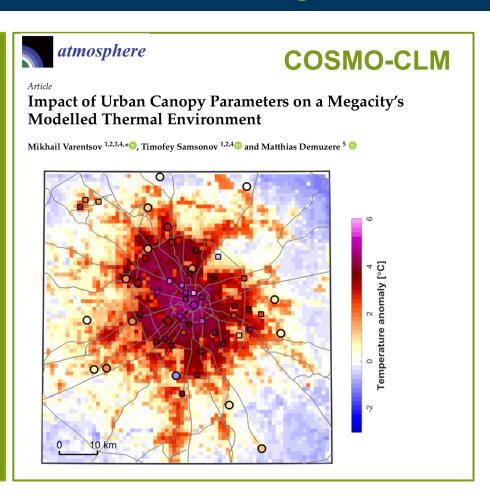
SUS 2040 RCP4.5



Verdonck et al.

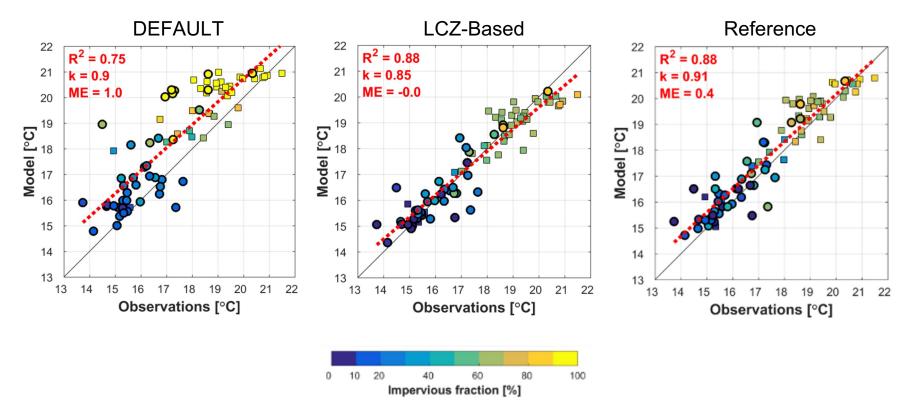
"This study compares three different approaches to define the urban canopy parameters for Moscow (Russia), using the COSMO numerical weather prediction and climate model coupled to TERRA_URB urban parameterization"

"... for the summer period, the LCZ-based and 'Reference' urban parameters show almost similar performance in terms of the modelled thermal environment, and provide noticeable improvements with respect to default urban description."



Varentsov et al. (2020)

Evaluation of nocturnal 2m air temperature averaged for August 2017



overview/

TOOLS

WUDAPT offers tools to generate data on form and function of urban areas and to apply them in different models and procedures.

Generate LCZ map (*L0* data)

- Generate LCZ training data
- · Classify your city

Use WUDAPT data in models

- WRF
- COSMO-CLM
- UMEP

Generate Urban Canopy Parameters

Convert cityGML and sealing data to UCPs (by Sebastian Schubert)

Summary, gaps, potential?

Local Climate Zone (maps) can serve as **a first-order proxy describing the heterogeneity of urban areas**, which in turn can serve as boundary conditions for urban parameterizations embedded within climate models. Various **tools are available / being developed** to facilitate this process.



Data-driven reading of LCZ map in local dialect (= Level-1 and -2 information)? Improve representation of informal settlements?



Collaboration to explore this big dataset!

Contact

Urban Climatology group, Ruhr-University Bochum (RUB), Germany









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