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Quantification of uncertainties of radiative transfer calculation in urban canopy models

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8 Abstract

9 Urban canopy models simplify urban morphology and physical processes such

¹⁰ as radiative transfer to calculate the urban surface energy balance as a lower

¹¹ boundary condition for atmospheric models at low computational cost. The

¹² present study uses a reference model of urban radiative transfer based on the

¹³ Monte Carlo method, which solves the radiative transfer equation by taking ¹⁴ into account the complex geometry of buildings and vegetation. Procedurally-

¹⁴ into account the complex geometry of buildings and vegetation. Procedurally-¹⁵ generated urban morphologies similar to the Local Climate Zones (LCZ) are

¹⁶ studied to cover the variety of urban forms that exist globally. The uncertain-

¹⁷ ties arising from the simplification of the urban morphology as an infinitely-

¹⁸ long street canyon or a regular array of square blocks are quantified. In addi-

¹⁹ tion, uncertainties due to the neglect of specular or spectral material reflectivi-

²⁰ ties and the involved atmosphere are investigated. It is found that for all LCZ,

²¹ the street canyon and block morphologies lead to a systematic overestima-

²² tion (underestimation) of the fraction of solar radiation absorbed by the walls

23 (ground). The neglect of pitched roofs has a strong influence on the simulated

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urban solar radiation budget for low solar elevation angles. Neglecting the 24 spectral reflectivity of urban materials does not lead to relevant uncertainties 25 in the broadband radiative fluxes. Specularly reflecting windows only change 26 the urban solar radiation budget for a central business district morphology 27 with a high glazing ratio. The participating atmosphere can strongly influence 28 the urban terrestrial radiation budget, especially for high-rise districts. Fu-29 ture urban canopy models should therefore improve the realism of the urban 30 morphology, and consider a participating atmosphere for the calculation of 31 terrestrial radiation. 32

Keywords Monte Carlo Method · Reference model · Uncertainty quantifica tion · Urban canopy model · Urban radiative transfer

35 1 Introduction

About 60% of the world's population lives in cities, and urbanisation is ex-36 pected to continue (UN 2019). Urban populations are potentially exposed to 37 heat stress, exacerbated by the (nocturnal) urban heat island (UHI) effect 38 (Arnfield 2003) and global climate change (Collins et al. 2013). Radiative 39 transfer in the complex three-dimensional urban morphology is a key physical 40 process for the UHI (Oke 1982; Krayenhoff et al. 2014; Best and Grimmond 41 2015), building energy consumption (Strømann-Andersen and Sattrup 2011; 42 Frayssinet et al. 2018), and human thermal comfort (Fröhlich and Matzarakis 43 2020; Dissegna et al. 2021; Geletič et al. 2022). Multiple reflections in the three-44 dimensional urban morphology reduce the effective solar reflectivity (albedo) of 45 cities and increase the effective emissivity of terrestrial radiation. The radiative 46 energy balance of the building envelope, and solar heat gain through windows 47 is different in dense urban areas compared to isolated buildings. This can af-48 fect building energy consumption for heating, ventilation, and air-conditioning 49 (HVAC), which accounts for about 40% of the global primary energy consump-50 tion (Yang et al. 2014). Outdoor human thermal comfort depends on the mean 51 radiant temperature (MRT) (Höppe 1999; Thorsson et al. 2007; Mayer et al. 52

⁵² 2008; Blazejczyk et al. 2012), which is influenced by solar shading and the

54 emission of terrestrial radiation by buildings.

⁵⁵ Numerical models have been developed to quantify the urban climate and

⁵⁶ to assess the impact of climate change mitigation and adaptation measures

⁵⁷ in urban areas. Urban canopy models (Grimmond et al. 2010, 2011) operate ⁵⁸ at the meso- (100 m to 10 km resolution) or global (10 km to 200 km reso-

⁵⁵ lution) scale and are based on a simplification of urban morphology (e.g., an

⁶⁰ infinitely-long street canyon) and physical processes such as radiative transfer.

⁶¹ The building-resolving urban climate models (about 1 m resolution) such as

⁶² Envi-Met (Bruse and Fleer 1998), Code_Saturne (Milliez and Carissimo 2007),

⁶³ IBM-WRF (Lundquist et al. 2012), MITRAS (Salim et al. 2018), PALM-4U

⁶⁴ (Maronga et al. 2020; Krč et al. 2021; Salim et al. 2022), or uDALES (Suter

et al. 2022) represent the detailed three-dimensional building morphology, but

⁶⁶ are so computationally expensive that they can only be used to simulate a

period of a few days for a part of a large city. They are not yet suitable for
 numerical weather prediction or regional climate simulations.

⁶⁹ The aim of the present study is to use a reference model of urban radiative

⁷⁰ transfer based on the Monte Carlo Method (MCM) (Villefranque et al. 2019,

⁷¹ 2022; Caliot et al. 2022) to quantify the uncertainties due to the simplification

⁷² of the radiative transfer calculation in urban canopy models. Such simplifica-

⁷³ tions are the use of a simple urban morphology (infinitely-long street canyon,

⁷⁴ regular blocks) with flat roofs, the assumption of broadband Lambertian ur-

⁷⁵ ban materials, or neglecting the scattering and absorption of radiation in the

⁷⁶ urban canopy layer by air, aerosols, or clouds. The present study addresses

 π $\,$ this knowledge gap to guide future developments of urban canopy models.

⁷⁸ 2 Radiative Transfer Calculation in Urban Canopy Models

79 2.1 Simplification of Radiative Transfer Calculation

102

The radiative transfer equation (RTE) describes the propagation of the three-80 dimensional field of spectral radiance in any direction through a potentially 81 scattering, absorbing, and emitting medium (participating medium). Bound-82 ary conditions (e.g., radiation from the sun at the top of the atmosphere or 83 reflection and emission from the ground) must be taken into account. Solving 84 the RTE for the urban canopy layer (the volume between the ground and the 85 tallest buildings), a large number of radiation propagation directions, on a 86 very high resolution grid (e.g., 1 m), and for the real complex urban morphol-87 ogy is too computationally expensive for urban canopy models. Instead, these 88 models simplify both the urban morphology and radiative transfer physics. 89 The peer-reviewed scientific literature published since 1970 that is referenced 90 by Google Scholar and indexed by the keywords urban canopy model, urban 91 climate model, or urban radiation has been reviewed to determine which radia-92 tive transfer calculation methods (Tab. 1) have been used and how the urban 93 morphology is simplified (Tab. 2). The following methods have been identified: 94

Prescribed net radiation: The net radiation at the surface is prescribed.
 This method can be used when net radiation observations are available.

⁹⁷ - Single reflection from a flat surface: The net exchanged solar (SW_{net}) and terrestrial radiative flux (LW_{net}) at the surface is calculated by as-⁹⁹ suming that the surface is flat. In this case, there is one reflection of the downwelling solar (SW_{down}) and terrestrial (LW_{down}) radiation at the sur-¹⁰¹ face:

$$SW_{net} = (\alpha - 1)SW_{down} \tag{1}$$

$$LW_{net} = \epsilon \left(\sigma T_s^4 - LW_{down}\right) \tag{2}$$

where α is the broadband albedo, ϵ the emissivity, and T_s is the skin surface temperature. The specifics of the three-dimensional urban morphology are not taken into account. - Single reflection from a flat surface with empirical modification of
 albedo and emissivity: The effect of the three-dimensional urban morphology is parameterised by an effective urban albedo (lower albedo than
 for a flat surface) and/or an effective urban emissivity (higher emissivity
 than for a flat surface) in Eqs. 1 and 2.

Horizontal layer representing the urban canopy: The urban canopy
 is represented by a horizontal layer that is located between the atmosphere
 and the ground. This layer may have a different albedo, emissivity, and
 skin surface temperature than the ground. It exchanges radiation with the
 sky and the ground.

- Extinction method: The urban canopy layer is treated as a turbid medium and the extinction of the radiation propagating through it due to interception by buildings is calculated using the Beer-Lambert law. For example, Chin et al. (2005) calculate the net radiation as a function of height, $R_{net}(z)$, based on the net radiation at the top of the urban canopy layer, $R_{net}(z_{top})$:

$$R_{net}(z) = R_{net}(z_{top}) \exp\left(-kL(z)\right),\tag{3}$$

where k is a user-defined extinction coefficient and L(z) is the cumulative index of the building surface area:

$$L(z) = \int_{z}^{z_{top}} \lambda_p(z') dz', \qquad (4)$$

where λ_p is the plane area building density.

Radiosity method with analytically calculated shape factors: It is 125 assumed that the urban surfaces (e.g., the roof, wall, and ground facets) are 126 opaque and reflect and emit radiation isotropically (Lambertian surfaces). 127 A matrix of shape factors is computed, which provides the information 128 about the fraction of radiation leaving facet i $(1 < i < N_f)$ that is inter-129 cepted by facet j ($1 < j < N_f$). The term shape factor is used here because 130 it specifies the radiative exchange for the average of the facet as opposed to 131 the view factor, which is specific to a single point (Harman et al. 2004). A 132 linear system of N_f equations is solved to calculate the radiation incident 133 on each facet as a function of downwelling solar or terrestrial radiation, 134 facet reflectivities, and temperatures. For urban morphologies consisting 135 of rectangular axis-parallel surfaces (e.g. an infinitely-long street canyon), 136 the shape factors can be calculated analytically. The contribution of the 137 atmosphere to the radiative exchange between urban facets is neglected. 138

- **Discrete ordinates method:** The RTE is solved assuming that the diffuse solar and terrestrial radiation travels into $2 N_{stream}$ discrete directions. An example is the two-stream approximation often used in atmospheric models, which solves for downwelling and upwelling radiation, e.g. there is only one stream per hemisphere ($N_{stream} = 1$).

- Radiosity method with shape factors calculated by MCM: This
 method is the same as the radiosity method, except for the calculation of

the shape factors. At the start of the simulation, rays are randomly traced

4

	Q4				
Method	Studies				
Prescribed net radiation	Myrup (1969); Tso et al. (1990)				
Single reflection from a	Carlson and Boland (1978); Todhunter and Terjung				
flat surface	(1988) (HFLUX); Saitoh et al. (1996)				
Single reflection from a flat surface with empirical modification of urban albedo and emissivity	Outcalt (1972); Todhunter and Terjung (1988) (URBD, only solar); Grossman-Clarke et al. (2005); Dupont and Mestayer (2006) (SM2-U); De Ridder et al. (2015) (UrbClim); Wouters et al. (2016) (SURY)				
Horizontal layer representing the urban canopy	Best (2005) (MOSES)				
Extinction method	Dupont et al. (2004) (DA-SM2-U); Chin et al. (2005)				
Radiosity method with analytically calculated shape factors	Arnfield (1976); Todhunter and Terjung (1988) (URBAN3); Sakakibara (1995); Mills (1997); Ca et al. (1999); Arnfield (2000); Masson (2000) (TEB); Kusaka et al. (2001) (SLUCM); Martilli et al. (2002) (BEP); Kondo et al. (2005); Krayenhoff and Voogt (2007) (TUF-2D, TUF-3D); Lee and Park (2008) (VUCM); Oleson et al. (2008); Porson et al. (2010) (MORUSES); Ryu et al. (2011); Thatcher and Hurley (2012); Schubert et al. (2012) (DCEP); Wang et al. (2013); Li et al. (2016) (LM3-UCM)				
Discrete ordinates method	Hogan (2019b) (SPARTACUS-Urban)				
Radiosity method with shape factors calculated	Kanda et al. (2005a,b) (SUMM); Krayenhoff et al. (2014); Wang (2014); Ryu et al. (2016); Nice et al. (2018) (VTUF-3D); Krayenhoff et al. (2020)				
by MCM	(BEP-Tree); Meili et al. (2020) (UT&C); Wang et al. (2021) (ASLUM)				

Table 1 Methods to calculate radiative transfer in urban canopy models

from each facet and it is count how many rays intersect another facet. The shape factors are calculated from the results of the MCM raytracing. This method is well suited for complex morphologies where it is not possible to calculate the shape factors analytically. For example, when representing urban vegetation, analytical shape factors can be calculated for a street canyon with one row of vegetation, but not for more complex vegetation shapes (Wang et al. 2021).

The most commonly used simplifications of urban morphology are the infinitely-154 long street canyon, the square, and the rectangular blocks. They are simple, 155 but allow the three-dimensional nature of urban morphology to be represented. 156 For such morphologies with axis-parallel rectangular Lambertian surfaces, it 157 is convenient to calculate urban radiation using the radiosity method with 158 analytically calculated shape factors. In the case of urban vegetation with a 159 complex shape, the shape factors must be calculated using the MCM. An al-160 ternative is to consider that the urban canopy layer is a turbid medium and 161 to use the Beer-Lambert extinction law to calculate how the radiation pass-162 ing through it is attenuated by collision with builings. Hogan (2019a,b) show 163 that for typical urban districts, the distribution of wall-to-wall distances is 164

Table 2 Simplified urban morphologies and number of layers (N_l) used in urban canopy models. For $N_l=1$, the radiative observables are calculated only at ground level, for $N_l=2$ they are calculated separately for the roof and the street canyon, for $N_l=3$ they are calculated for the roof, wall, and ground, and for $N_l = N$, the radiative observables are calculated for a user-defined number of layers

Morphology	Studies	Number of
		layers
Flat surface	Myrup (1969); Outcalt (1972); Carlson and Boland (1978); Todhunter and Terjung (1988) (HFLUX, URBD); Tso et al. (1990); Saitoh et al. (1996); Grossman-Clarke et al. (2005); Dupont and Mestayer (2006) (SM2-U); De Ridder et al. (2015) (UrbClim); Wouters et al. (2016) (SURY)	1
Horizontal layer representing the urban canopy	Best (2005) (MOSES)	1
Vertically extended porous medium	Dupont et al. (2004) (DA-SM2-U); Chin et al. (2005)	N
Street canyon	Porson et al. (2010) (MORUSES); Li et al. (2016) (LM3-UCM);	2
	Arnfield (1976); Sakakibara (1995); Ca et al. (1999); Arnfield (2000); Masson (2000) (TEB); Kusaka et al. (2001) (SLUCM); Lee and Park (2008) (VUCM); Ole- son et al. (2008); Ryu et al. (2011); Thatcher and Hurley (2012); Ryu et al. (2016); Meili et al. (2020) (UT&C); Wang et al. (2021) (ASLUM)	3
	Martilli et al. (2002) (BEP); Wang et al. (2013); Wang (2014); Krayenhoff et al. (2020) (BEP-Tree)	N
Double street canyon	Schubert et al. (2012) (DCEP)	N
Rectangular blocs	Todhunter and Terjung (1988) (URBAN3)	3
Sewana blaca	Mills (1997); Kanda et al. (2005a,b) (SUMM)	3
Square blocs	Kondo et al. (2005)	Ν
Array of rectan- gular buildings with axis-parallel surfaces	Krayenhoff and Voogt (2007) (TUF-2D, TUF-3D); Krayenhoff et al. (2014); Nice et al. (2018) (VTUF- 3D)	Ν
Exponential distri- bution of wall-to- wall distances	Hogan (2019b) (SPARTACUS-Urban)	N

¹⁶⁵ exponential, implying that radiative transfer in the urban canopy layer can be

- $_{166}$ $\,$ solved similarly to atmospheric radiative transfer.
- ¹⁶⁷ In summary, the assumption of broadband Lambertian urban materials, the
- ¹⁶⁸ neglect of participating air, aerosols, or clouds in the urban canopy layer, the
- ¹⁶⁹ simplification of the urban morphology by a street canyon or regular blocks
- 170 with flat roofs are ubiquitous in urban canopy models. Therefore, the uncer-
- 171 tainties of these simplifications are investigated in the present study.

172 2.2 Previous Uncertainty Analyses

173 2.2.1 Reflections

Arnfield (1976), Kobayashi and Takamura (1994), Montávez et al. (2000), Har-174 man et al. (2004), and Yang and Li (2013) have studied the effect of (multiple) 175 reflections on the urban radiation budget. They found that the importance of 176 multiple reflections is higher when the albedo (emissivity) of different urban 177 facets is higher (lower), and when the urban morphology is denser and taller. 178 As most urban materials have a ϵ close to 1, but typical values of α are between 179 0.1 and 0.5, a lower number of reflections is usually assumed for terrestrial ra-180 diation than for solar radiation. 181

182 2.2.2 Specularly Reflecting Materials

Aida and Gotoh (1982) used a MCM radiation model to quantify the effect of 183 specular reflections on the effective albedo of a street canyon for the extreme 184 case where the entire street canyon consists of purely specularly reflecting ma-185 terials. They found that the albedo is 15% higher for a solar zenith angle of 186 0° , because purely specular reflection from the ground leads to a strong re-187 duction in multiple reflections compared to pure Lambertian reflection. The 188 albedo is 50% lower for a solar zenith angle of 80° because the specular re-189 flection from the wall surfaces leads to more reflected radiation downwards 190 compared to pure Lambertian reflection. However, for real cities, less influence 191 from specularly reflecting materials can be expected because it is not realistic 192 for all surfaces to be pure specular reflectors. Verseghy and Munro (1989a) 193 found discrepancies of 5 to 10 W m^{-2} between their numerical model assum-194 ing Lambertian reflections and observations on a building wall. This could be 195 explained by specular reflection of direct solar radiation from windows on the 196 opposite wall. Kotthaus and Grimmond (2014) performed flux observations in 197 the Central Business District (CBD) of London and found that at their site 198 and under clear-sky conditions, the surface albedo can be strongly influenced 199 by specular reflections. 200

201 2.2.3 Participating Atmosphere

Verseghy and Munro (1989b) investigated the influence of the participating 202 atmosphere using a numerical model of radiative transfer in a building court-203 yard. They found that neglecting the absorption by the air that is colder than 204 the walls leads to an overestimation of the incoming longwave radiation at the 205 wall surfaces by 8 to 9 W m⁻² for clear-sky conditions and by 4 to 7 W m⁻² for 206 overcast conditions. Based on a numerical study, Hogan (2019b) showed that 207 atmospheric absorption significantly modifies the energy balance of the urban 208 canopy and that its effect increases with building height. Net absorption by air 209 in the urban canopy layer was found to be 75 W m⁻² for 50 m high buildings 210 and the wall surface temperature was 10 K higher than the air temperature. 211

212 2.2.4 Isotropic Downwelling Radiation

Urban radiation models typically assume that the downwelling solar diffuse 213 and terrestrial radiation are isotropic. Verseghy and Munro (1989a) found 214 that for clear-sky conditions, this assumption leads to an underestimation 215 (overestimation) of the incoming solar radiation at the sunlit (shaded) walls. 216 This is because, in the real-world, most of the diffuse solar radiation comes 217 from a direction that is close to the direction of the sun. When the urban 218 canopy model is coupled with an atmospheric model using delta-Eddington 219 scaling (Joseph et al. 1976) in the radiation scheme, this will not be the case as 220 circumsolar scattered radiation is treated as direct solar radiation to improve 221 the accuracy of the total solar radiation. For terrestrial radiation, Verseghy and 222 Munro (1989b) found that the assumption of isotropic downwelling radiation 223 leads to an underestimation of the radiation incident on a vertical wall, since 224 more terrestrial radiation comes from the parts of the sky close to the horizon 225 than from those at the zenith. 226

3 Reference Model of Urban Radiative Transfer

²²⁸ 3.1 The HTRDR-Urban Monte-Carlo Model of Urban Radiative Transfer

The HTRDR-Urban reference model of urban radiative transfer has been in-229 troduced by Caliot et al. (2022). It is based on the MCM and solves the RTE 230 for solar and terrestrial radiation taking into account the participating atmo-231 sphere with non-gray absorption, emission, and anisotropic scattering. The 232 solar and terrestrial radiative flux densities are calculated with a backward 233 MCM using the null-collision technique (Galtier et al. 2013; El Hafi et al. 234 2021) and accelerating grids (Villefranque et al. 2019). The upper boundary 235 is the top of the atmosphere (TOA), where is the solar spectrum irradiance 236 obtained by averaging the data of year 2020 from the data set Coddington 237 et al. (2015). The lower boundary is the Earth's surface consisting of vege-238 tation and buildings. Material surfaces are assumed to be opaque and reflect 239 radiation in a Lambertian or specular manner, with a spectral dependence of 240 their reflectivity. The Spectral Library of impervious Urban Materials (SLUM) 241 available from the London Urban Micromet data Archive (LUMA) (Kotthaus 242 et al. 2013, 2014) with measured spectral Lambertian reflectivities is included 243 in HTRDR-Urban. The specular reflectivity of window glass is calculated with 244 the measured complex refractive index given by Rubin (1985). The constant 245 surface temperature of different facets can be specified. The participating at-246 mosphere is characterised by the 3D fields of spectral and directional radiative 247 properties of gases, liquid droplets, and solid particles, which can be specified 248 by the user as data of absorption and scattering coefficient data and scattering 249

²⁵⁰ phase functions.

227

²⁵¹ 3.2 Calculation of Mean Radiant Temperature

HTRDR-Urban can be used to calculate the MRT, which is one of the input 252 variables for thermal climate indices such as the Physiological Equivalent Tem-253 254 perature (PET) (Höppe 1999) or the Universal Thermal Climate Index (UTCI) (Blazejczyk et al. 2012). For this purpose, a user-defined file in wavefront for-255 mat with the desired human-like geometry can be provided to HTRDR-Urban. 256 An MRT map of user-defined spatial extent and resolution is obtained by plac-257 ing the human-like geometry for each realization of the MCM algorithm at a 258 random location in each grid point of the MRT map and by rotating it by a 259 random azimuth angle between 0° and 360° . The solar $(\dot{Q}_{\text{body,sw}})$ and terres-260 trial $(\dot{Q}_{\text{body,lw}})$ radiative flux density incident on the human-like geometry is 261 calculated using the algorithms described in Caliot et al. (2022). The MRT is 262 then calculated by 263

$$MRT = \left(\frac{(1 - \alpha_{\text{body}})\dot{Q}_{\text{body,sw}} + \dot{Q}_{\text{body,lw}}}{\epsilon_{\text{body}} \sigma}\right)^{0.25}.$$
 (5)

 $\alpha_{\rm body}$ and $\epsilon_{\rm body}$ are the broadband solar albedo and thermal emissivity of the 264 human body. In the present study, the human body is a cylinder of 1 m height 265 and 0.14 m radius centred at 1.1 m above the ground. With this choice, similar 266 to Thorsson et al. (2007) and Dissegna et al. (2021), the radiative fluxes in the 267 horizontal direction have a weight of 0.88, while the upwelling and downwelling 268 fluxes have a weight of 0.06. The values of α_{body} and ϵ_{body} are set to 0.3 and 269 0.95 respectively. In the current implementation of the MRT calculation, the 270 human body does not affect the radiative transfer in the urban scene. 271

272 4 Procedurally-generated Urban Morphologies

273 4.1 Procedural City Generator

The urban morphologies studied are created using an in-house procedural city 274 generator. It assumes a flat terrain and generates a major road network start-275 ing from a central square in radial mode (Kelly and McCabe 2006), based 276 on user-specified values for the number of sectors, the radius of the central 277 square, and the ring of major roads. The space in between the major roads is 278 filled with rectangular terrains of a user-specified length and width distribu-279 tion. There are five geometric primitives of building types: 1) buildings aligned 280 with the major roads and 2-5) rectangular buildings with four different roof 281 types. Only the building type 1, which is aligned with the roads, can be placed 282 on the terrains adjacent to major roads. The user defines the probability that 283 a terrain will be covered by a given building type, and for each building type 284 the statistical distribution of its width, length, and number of storeys. 285

²⁸⁶ 4.2 Urban Morphologies

Urban morphologies are based on the Local Climate Zone (LCZ) classification 287 of Stewart and Oke (2012). The lightweight low-rise LCZ7 is excluded as it 288 differs from the dense low-rise LCZ3 by the use of light materials, which is not 289 relevant to the present study. Based on the results of Tornay et al. (2017), who 290 conducted a survey with urban planners about urban morphologies typically 291 found in French cities, we further differentiate compact mid-rise LCZ2 into 292 compact mid-rise blocks (LCZ2a, the buildings are aligned with the streets) 293 and compact mid-rise rows (LCZ2b, the buildings form rows). The same is 294 done for the open low-rise LCZ6. These additional morphologies better repre-295 sent the urban forms found in European cities. An additional CBD morphology 296 with open high-rise buildings and a facade glazing ratio (f_q) of 0.9 is created 297 for the study of speculary-reflecting windows. The horizontal extent of the ur-298 ban morphologies is a square of 800 m side length, except for LCZ4 (1200 m) 299 and CBD (400 m). 300

The urban morphologies are characterised by the morphology parameters, plane area building density (λ_p ; Eq. 6), external facade surface density (λ_w ; Eq. 7), and mean building height (H_{mean} ; Eq. 8). The footprint area of building n is A_n , its external facade area is AF_n , and its height is H_n . The total number of buildings in a district is N_{build} and the total horizontal area of the district is $A_{district}$.

307

$$\lambda_p = \frac{\sum_{n=1}^{N_{build}} A_n}{A_{district}} \tag{6}$$

$$\lambda_w = \frac{\sum_{n=1}^{N_{build}} AF_n}{A_{district}} \tag{7}$$

$$H_{mean} = \frac{\sum_{n=1}^{N_{build}} A_n H_n}{\sum_{n=1}^{N_{build}} A_n} \tag{8}$$

Simplified morphologies are generated for each district to allow for comparison and assessment of uncertainties. These are: a representative street canyon, a regular arrangement of square blocks, and a flat ground. The representative infinitely-long street canyon has a building height equal to H_{mean} and the

 $_{\rm 312}$ $\,$ height-over-width ratio (aspect ratio) of the street is calculated as follows

$$\frac{H}{W} = \frac{0.5\lambda_w}{1-\lambda_p}.$$
(9)

The regular square blocks of height H_{mean} have a side length (l_{side}) on a square plot of length (l_{total}) :

$$l_{side} = \frac{4\lambda_p H_{mean}}{\lambda_w} \tag{10}$$

$$l_{total} = \frac{l_{side}}{\sqrt{\lambda_p}} \tag{11}$$



Fig. 1 Rendering of the LCZ9 morphology with 1045 trees of the same type and a height of 10 m in the visible part of the solar spectrum. The number of pixels is 1500×800 , the vertical field of view is 70° , and the number of samples per pixel is 200

- ³¹⁵ The representative flat ground is the same as the representative street canyon,
- but with $H_{mean} = 0$ m. For all morphologies, potential overhanging roofs that

³¹⁷ may occur in real cities are not considered. The morphologies LCZ2a, LCZ2b,

LCZ5, LCZ6a, LCZ6b, and LCZ9 have pitched roofs. Since pitched roofs are

³¹⁹ not considered in the representative street canyon or regular square blocks, a

³²⁰ copy of these morphologies with flat roofs is created to quantify the effect of ³²¹ pitched roofs. A realistic window geometry (window sill, glass pane surface) is

³²¹ pitched roots. A realistic window geometry (window sill, glass pane surface) is ³²² present, except for the urban morphologies LCZ8 (large low-rise) and LCZ10

present, except for the urban morphologies LCZ8 (large low-rise) and LCZ10 (heavy industry), which have no windows. The 12 urban morphologies are pre-

323 (heavy industry), v
324 sented in Tab. 3.

Trees represented by trunks, branches, and individual leaves, can be placed in the procedurally-generated urban morphologies. In the present study, a sepa-

³²⁷ rate version of the LCZ2a, LCZ4, LCZ5, and LCZ9 morphologies is created,

 $_{\rm 328}$ $\,$ in which trees of the same type with a height of 10 m, a diameter of 10.55 m,

 $_{329}$ and a leaf area index (LAI) of 2.24 are placed so that they do not intersect the

 $_{\tt 330}$ $\,$ buildings. Because of the different values of λ_p in these morphologies, a differ-

ent number of trees can be placed in the morphologies (64 trees for LCZ2a, 963

for LCZ4, 869 for LCZ5, and 1045 for LCZ9). The plane area surface fraction covered by trees is 0.01 for LCZ2a, 0.13 for LCZ4, 0.12 for LCZ5, and 0.14 for

³³³ covered by trees 1s ³³⁴ LCZ9 (Fig. 1).

4.3 Distributions of Wall-to-wall and Wall-to-ground Distances

The distributions of wall-to-wall (p_{ww}) and wall-to-ground distances (p_{wg}) are

³³⁷ crucial for urban radiative transfer since they determine how much radiation

³³⁸ travelling through the urban canopy layer is intercepted by the different facets

Urban morphology	Realistic morphology	Street canyon	Square blocks
LCZ1: Compact high-rise $\lambda_p = 0.46; \ \lambda_w = 6.6; \ H_{mean} = 86.2 \text{ m}; \ H_{max} = 115.1 \text{ m}; \ \sigma_H = 15.1 \text{ m}; \ \frac{H}{W} = 6.1; \ f_g = 0.3$			
LCZ2a: Blocks of compact mid-rise $\lambda_p = 0.53; \lambda_w = 1.21; H_{mean} = 16.1 \text{ m};$ $H_{max} = 25.5 \text{ m}; \sigma_H = 3.9 \text{ m};$ $\frac{H}{W} = 1.29; f_g = 0.3$			
LCZ2b: Rows of compact mid-rise $\lambda_p = 0.35; \lambda_w = 0.97; H_{mean} = 17.2 \text{ m};$ $H_{max} = 25.5 \text{ m}; \sigma_H = 4.9 \text{ m};$ $\frac{H}{W} = 0.75; f_g = 0.3$			
LCZ3: Compact low-rise $\lambda_p = 0.40; \lambda_w = 0.58; H_{mean} = 5.8 \text{ m};$ $H_{max} = 11.0 \text{ m}; \sigma_H = 1.4 \text{ m};$ $\frac{H}{W} = 0.48; f_g = 0.3$			
LCZ4: Open high-rise $\lambda_p = 0.23; \ \lambda_w = 1.83; \ H_{mean} = 47.1 \text{ m}; \ H_{max} = 62.7 \text{ m}; \ \sigma_H = 8.0 \text{ m}; \ \frac{H}{W} = 1.19; \ f_g = 0.3$			
LCZ5: Open mid-rise $\lambda_p = 0.32; \ \lambda_w = 1.18; \ H_{mean} = 15.6 \text{ m}; \ H_{max} = 22.0 \text{ m}; \ \sigma_H = 3.7 \text{ m}; \ \frac{H}{W} = 0.87; \ f_g = 0.3$			
LCZ6a: Blocks of open low-rise $\lambda_p = 0.38; \lambda_w = 0.58; H_{mean} = 6.8 \text{ m};$ $H_{max} = 12.6 \text{ m}; \sigma_H = 1.8 \text{ m};$ $\frac{H}{W} = 0.47; f_g = 0.3$			
LCZ6b: Rows of open low-rise $\lambda_p = 0.25; \lambda_w = 0.29; H_{mean} = 5.9 \text{ m};$ $H_{max} = 9.4 \text{ m}; \sigma_H = 1.2 \text{ m};$ $\frac{H}{W} = 0.19; f_g = 0.3$	the sta		
LCZ8: Large low-rise $\lambda_p = 0.31; \lambda_w = 0.27; H_{mean} = 7.0 \text{ m};$ $H_{max} = 12.1 \text{ m}; \sigma_H = 1.8 \text{ m};$ $\frac{H}{W} = 0.2; f_g = 0.0$			
LCZ9: Sparsely built $\lambda_p = 0.11; \ \lambda_w = 0.23; \ H_{mean} = 5.9 \text{ m};$ $H_{max} = 10.6 \text{ m}; \ \sigma_H = 1.4 \text{ m};$ $\frac{H}{W} = 0.13; \ f_g = 0.3$			
LCZ10: Heavy industry $\lambda_p = 0.25; \ \lambda_w = 0.6; \ H_{mean} = 13.0 \text{ m}; \ H_{max} = 21.0 \text{ m}; \ \sigma_H = 4.6 \text{ m}; \ \frac{H}{W} = 0.4; \ f_g = 0.0$			
$ \begin{array}{l} \textbf{CBD: Central Business District} \\ \lambda_p = 0.24; \lambda_w = 3.1; H_{mean} = 75.2 \text{ m}; \\ H_{max} \ 120.1 = \text{m}; \ \sigma_H = 22.2 \text{ m}; \\ \frac{H}{W} = 2.0; \ f_g = 0.9 \end{array} $			

Table 3 Rendering of the procedurally-generated urban morphologies in the visible part of the solar spectrum and its representative infinitely-long street canyon and regular array of square blocks. σ_H is the standard deviation of individual building heights, H_{max} the maximum building height. No simplified street canyon and block geometries are analysed for the CBD

(Hogan 2019a). Hogan (2019a) studied these distributions for four real urban 339 areas (central and residential London, downtown and residential Los Angeles) 340 and compared them with two theoretical distributions: 1) the one that would 341 be obtained for an infinitely-long street canyon, and 2) an exponential decay 342 of p_{ww} and p_{wq} with increasing distance. It was found that p_{ww} for the real 343 cities fits the exponential distribution well for distances between 0 and 200 m. 344 The assumption of a street canyon geometry leads to a particularly bad p_{ww} 345 for small distances, since it cannot represent buildings closer to each other 346 than the width of the street canyon. For distances greater than 200 m and the 347 districts in Los Angeles, the p_{ww} distribution obtained for the street canyon 348 morphology is closer to the real distribution than the exponential distribution. 349 For the districts in London, the real distribution lies in between the exponen-350 tial and street canyon distributions. For p_{wq} , the exponential distribution fits 351 best for distances below 200 m, while neither the exponential nor the infinite 352 street canyon distribution fits well for larger distances. Stretton et al. (2022) 353 analysed p_{ww} and p_{wg} for central London and Indianapolis (US) and found 354 a relatively similar performance of the exponential model than Hogan (2019a). 355 HTRDR-Urban is used to determine p_{ww} and p_{wg} for the procedurally-generated 356 urban morphologies. For p_{ww} , 10⁶ rays are traced from a random point on a 357 wall in the horizontal direction, and if the ray hits another wall, the distance 358 that has been travelled is recorded. For p_{wq} , 10⁶ rays are traced in a randomly 359 chosen downward direction from a random point on a wall. Figure 2 shows 360 the results for LCZ2a, LCZ4, and LCZ9, the results for the remaining urban 361 morphologies are shown in the supplementary Figs. 14 to 16. In general, the 362 p_{ww} and p_{wq} distributions are close to the exponential distribution for small 363 distances (up to 100 m to 200 m) and deviate considerably at higher distances. 364 For LCZ2a and LCZ4 and distances greater than 200 m, the theoretical distri-365 bution obtained for the infinite street canyon fits better than the exponential 366 distribution for p_{ww} , a result that is similar to Hogan (2019a)'s finding for 367 downtown and residential Los Angeles. For p_{wg} , the exponential distribution 368 is the best fit, even at higher distances. The distributions of p_{ww} and p_{wg} for 369 the procedurally-generated cities are similar to those for real cities. 370

371 5 Methodology

³⁷² 5.1 Setup of Sensitivity Studies

The solar radiation budget in the layer of air between the ground and the 373 height of the tallest building (Urban Canopy Layer, UCL) is investigated. The 374 only source of energy is the downwelling solar radiation (Q_D) at the top of the 375 UCL. The \dot{Q}_D can be absorbed by the roofs (\dot{Q}_R) , the facades (\dot{Q}_F) ; the sum of 376 the absorption by walls and windows), the ground (Q_G) , potential trees (Q_T) , 377 and the air in the UCL (Q_{air}) . The radiation that is not absorbed leaves the 378 UCL towards the sky (Q_U) . These radiative observables are studied because 379 the main objective of the radiation calculation in urban canopy models is to 380



Fig. 2 Distribution of wall-to-wall (p_{ww}) and wall-to-ground (p_{wg}) distances for the urban morphologies LCZ2a, LCZ4, and LCZ9 and their representative infinitely-long street canyon and regular array of square blocks

³⁸¹ calculate the effective albedo, emissivity, and radiative surface temperature of

- the urban area as these variables are coupled with the radiation scheme of the atmospheric model. A secondary objective may be to provide more detail
- the atmospheric model. A secondary objective may be to provide more detail on the radiation absorbed by different urban facets (e.g. the average solar
- radiation incident on all building facades) as the urban canopy models could
- ³⁸⁶ solve the energy budget of different urban facets separately.
- In Sect. 6, the different terms of the solar radiation budget are displayed normalised by the downwelling solar radiation at the top of the urban canopy layer (\dot{Q}_D) . The normalised values are denoted by \dot{q}_U , \dot{q}_R , \dot{q}_F , \dot{q}_G , and \dot{q}_T , for the upwelling solar radiation, and the radiation absorbed by the roofs, the facades, the ground, and the trees respectively. The terrestrial radiation budget consists of the longwave radiation exchanged by the sky (\dot{E}_{sky}) , the roofs (\dot{E}_R) , the facades (\dot{E}_F) , the ground (\dot{E}_G) , the trees (\dot{E}_T) , and the air
- 394 $(E_{air}).$
- ³⁹⁵ Different boundary conditions for downwelling radiation are investigated:
- For direct-only downwelling solar radiation, only radiation from the so-396 lar disc reaches the top of the urban canopy layer; there is no radiation 397 scattered by the atmosphere. To achieve this with HTRDR-Urban, the ra-398 diative properties of the atmosphere are set to vacuum ones. Simulations 399 are performed for solar elevation angles (γ) of 1°, 5°, 10°, 20°, 30°, 45°, 400 60° , 75° , and 90° . The solar azimuth angle is sampled evenly between 0° 401 and 360°. A larger number of MCM realisations is required for lower values 402 of γ to achieve a given accuracy of the radiative observables. Therefore, the 403 number of MCM realisations is calculated as follows 404

$$N_{\gamma} = int \left(\frac{N_{zen}}{\sin(\gamma)}\right). \tag{12}$$

 N_{zen} is the number of realisations when the sun is at the zenith ($\gamma = 90^{\circ}$). Rounding to the nearest integer is denoted by *int*.

⁴⁰⁷ – For the diffusive-only downwelling solar radiation, the solar radiation reach-⁴⁰⁸ ing the top of the urban canopy layer is perfectly diffusive (e.g. similar to ⁴⁰⁹ an overcast sky with an optically thick cloud). To technically achieve this ⁴¹⁰ with HTRDR-Urban, the atmospheric radiative properties are also set to ⁴¹¹ vacuum ones, and a sky model with isotropic downwelling solar radiation ⁴¹² with \dot{Q}_D normalised to 1 W m⁻² is employed. The number of MCM reali-⁴¹³ sations is N_{zen} . There is no dependence of the results on γ .

For the clear-sky conditions, the default atmospheric conditions consist of
 the one-dimensional atmospheric profile from Hogan and Bozzo (2018).

⁴¹⁶ 5.2 Simplification of Urban Morphology

417 To quantify the uncertainty due to the simplification of the urban morphology,

- 418 HTRDR-Urban simulations are performed for real morphologies and their cor-
- ⁴¹⁹ responding simplifed morphologies such as infinitely-long street canyon, reg-
- ⁴²⁰ ular square blocks, and flat ground. All urban morphologies, including those

 $_{\tt 421}$ $\,$ with flat roofs are studied. All surfaces are made of a Lambertian grey material

with a solar albedo of 0.3. Both direct and diffuse solar radiation boundary

423 conditions are considered. The value of N_{zen} is 10⁶.

⁴²⁴ 5.3 Influence of Spectrally-reflecting Materials

The influence of spectrally-reflecting materials on the urban solar radiation 425 budget is studied for all urban morphologies. Measured spectral reflectivities 426 are available from the spectral library of impervious urban materials (SLUM), 427 which is part of the London urban micrometeorological archive (LUMA) (Kot-428 thaus et al. 2013). An extreme case is considered. The roofs are made of rusting 429 cement red roofing tiles (R008), the facades of the weathered metal with cop-430 per patina (Z004), and the ground of white weathered concrete (C006). In the 431 solar spectrum band, the albedo of the material C006 is low (0.2 at 350 nm), 432 but increases towards 0.5 at 600 nm. It remains relatively constant for larger 433 wavelengths. The metal Z004 has an albedo that varies along the solar spec-434 trum. It is very low (0.1) at 350 nm, has a maximum of 0.55 at 500 nm, a 435 minimum of 0.27 at 650 nm, very high values (0.65 - 0.7) between 750 and 436 1100 nm, and another minimum (0.25) at 1500 nm. The Z004 material is one 437 of the materials with the largest variation in albedo with wavelength along 438 the solar spectrum that is included in the SLUM dataset. HTRDR-Urban 439 simulations are performed for direct-only and diffusive-only downwelling solar 440 radiation. HTRDR-Urban is used to calculate the incident radiative flux den-441 sity (\dot{I}_{facet}) on a specific type of facet (e.g., the roofs) and absorbed (Q_{facet}) 442 by that type of facet. From the results, the effective broadband albedo (α_{eff}) 443 of this facet is calculated for each urban morphology, γ , and the radiative 444 boundary condition following: 445

$$\alpha_{eff}(LCZ,\gamma) = 1 - \frac{\dot{Q}_{facet}(LCZ,\gamma)}{\dot{I}_{facet}(LCZ,\gamma)}.$$
(13)

⁴⁴⁶ α_{eff} is the broadband albedo that a material must have in order for the ⁴⁴⁷ broadband reflected radiative flux density to be the same as if the spectral ⁴⁴⁸ albedo of the material were used. It depends on the urban morphology or ⁴⁴⁹ the solar elevation angle, as these can change the spectral composition of ⁴⁵⁰ the radiation reaching a given surface. The HTRDR-Urban simulations are ⁴⁵¹ repeated using the values of α_{eff} as the broadband albedo. For all simulations, ⁴⁵² the value of N_{zen} is 10⁶.

⁴⁵³ 5.4 Influence of Specular Reflections from Windows

The influence of specular reflections from windows is studied for the urban
morphologies LCZ1, LCZ2a, LCZ9, and CBD. The boundary condition corresponds to a clear-sky situation. The spectral reflectivities of the non-glass
materials are taken from the SLUM database. All roofs are made of rusting

cement red roofing tiles (R008), all walls are made of white weathered con-458 crete (C006), and all ground surfaces are made of black tarmac asphalt (A009). 459 Three simulations are made for each morphology and γ : 460

- No windows. The material of the window glass pane is the same as for 461 the wall (C006), 462
- Specular windows. The material of the window glass pane is soda lime 463 silica glass. The spectral complex refractive index is taken from Rubin 464 (1985) and is used by HTRDR-Urban to calculate the directional and spec-465 tral specular reflectivity. 466
- Lambertian windows. The window glass pane is made of a hypotheti-467 cal Lambertian material with an effective broadband reflectivity, which is 468 calculated for each urban morphology and γ as a function of the incident 469 $(I_{win,spec})$ and absorbed $(Q_{win,spec})$ solar radiation from the **Specular** 470 windows case: 471

$$\alpha_{win,Lam}(LCZ,\gamma) = 1 - \frac{\dot{Q}_{win,spec}(LCZ,\gamma)}{\dot{I}_{win,spec}(LCZ,\gamma)}.$$
(14)

For the specular windows simulations, a large value of $N_{zen} = 5 \times 10^8$ is used 472 because Caliot et al. (2022) found convergence problems in the MCM algorithm 473 due to the rare events of specular reflections of solar spectral irradiance.

474

5.5 Influence of the Participating Atmosphere in the Urban Canopy Layer 475

The influence of the participating atmosphere on the urban terrestrial radi-476 ation budget is studied for all urban morphologies. All surfaces are made of 477 a grey Lambertian material with a broadband emissivity of 0.9. Four one-478 dimensional clear-sky atmospheric profiles are considered: Tropical (TRO), 479 Mid-Latitude Summer (MLS), Mid-Latitude Winter (MLW), and Sub-Arctic 480 Winter (SAW). The radiation scheme of the European Centre for Medium-481 range Weather Forecasts (ECMWF) (ECRAD, Hogan and Bozzo (2016)) is 482 used to calculate the atmospheric radiative properties for these profiles. The 483 near surface air temperature is 300 K, 294.2 K, 272.06 K, and 257.2 K for 484 TRO, MLS, MLW, and SAW, respectively. The skin surface temperature of 485 all urban facets is the same and is varied as a function of the near-surface air 486 temperature to obtain a desired difference between the skin surface tempera-487 ture and the near-surface air temperature (ΔT_{surf}) . Simulations are performed 488 for $\Delta T_{surf} = -10$ K, 0 K, 10 K, 20 K, and 30 K. The MCM simulations are 489 performed once with the real atmospheric properties and once with the atmo-490 spheric properties in the urban canopy layer set to vacuum ones. The value of 491 N_{zen} is set to 5×10^5 . 492

5.6 Influence of Urban Trees 493

- MCM simulations of the solar and terrestrial radiation budgets are made for 494
- the urban morphologies LCZ2a, LCZ4, LCZ5, and LCZ9 with and without 495

trees. For the solar (terrestrial) radiation, all urban surfaces including the trees 496 are made of Lambertian grey materials with a broadband albedo (emissivity) of 497 0.4 (0.9). For the solar radiation, the direct-only and diffusive-only downwelling 498 solar radiation boundary conditions are analysed. For the terrestrial radiation, 499 the one-dimensional atmospheric profile corresponds to the clear-sky MLS. 500 The value of ΔT_{surf} is varied between -10 K, 0 K, 10 K, 20 K, and 30 K and 501 is applied to all materials, except for the leaves. For these, the skin surface 502 temperature is assumed to be equal to the air temperature. N_{zen} is 10^6 . 503

504 5.7 Influence of Urban Fog

 $_{505}$ The solar and terrestrial radiation budgets are simulated for the urban mor-

⁵⁰⁶ phologies LCZ2a, LCZ4, LCZ5, and LCZ9 for different densities of urban fog.
 ⁵⁰⁷ For the solar (terrestrial) radiation, all surfaces are made of Lambertian grey

materials with a broadband albedo of 0.3 (0.9). The atmospheric profile at

altitudes above 130 m a.g.l. corresponds to the clear-sky MLS. Below 130 m

⁵¹⁰ a.g.l., there is a layer of fog with a homogeneous liquid water mixing ratio.

511 Simulations with different values of the mixing ratio (0.05, 0.1, 0.2, 0.5, and

 $_{512}$ 1 g kg⁻¹) are performed. A case without fog is also simulated. The value of

513 N_{zen} is set to 10⁶.

514 6 Results

515 6.1 Simplification of Urban Morphology

⁵¹⁶ Figure 3 shows the results for the direct-only urban radiation budget in LCZ1.

⁵¹⁷ Results for the other morphologies are shown in the supplementary Figs. 17-32.

⁵¹⁸ The results for the sparsely-built low-rise LCZ9 geometry, the dense mid-rise

⁵¹⁹ LCZ2a, and the dense high-rise LCZ1 are discussed in detail, while the results

⁵²⁰ for the other morphologies are summarised.

521 For the LCZ9 morphology with flat roofs (Fig. 17), there is no difference of \dot{q}_R

between the real morphology and the simplified ones for γ above 20°. For lower

 γ , the absorption by the flat roofs is lower for the real morphology than for the simplified morphologies, which is due to shading. The normalised upwelling so-

⁵²⁵ lar radiative flux \dot{q}_U is exactly 0.3 for the corresponding flat ground geometry

526 because there is no shading. For the other morphologies, due to multiple reflec-

 \dot{q}_{U} is less than 0.3 and tends to decrease with γ . The differences between

the results obtained with the real urban morphology and the representative

street canyon or regular blocks are small. \dot{q}_F is low for high γ and increases with lower γ as more radiation illuminates the facades. For γ values below 20°,

⁵³⁰ with lower γ as more radiation illuminates the facades. For γ values below 20°, ⁵³¹ \dot{q}_F is slightly lower for the real morphology than for the simplified morpholo-

⁵³² gies. This is due to the distance between buildings and the layout design of

⁵³³ the real morphologies. In fact, as shown in Fig. 2, for realistic morphologies,

⁵³⁴ buildings can be closer to each other than for the street canyon and regular

18

⁵³⁵ block geometries, for which there is a minimum distance between buildings.

536 In addition, the realistic layout includes large roads and central squares that

⁵³⁷ allow the sun's rays to reach the ground. This is expected to result in more

⁵³⁸ shading from one building onto the facade of another in realistic morphol-⁵³⁹ ogy results, whereas for the simplified morphologies, the minimum distance

⁵³⁹ ogy results, whereas for the simplified morphologies, the minimum distance ⁵⁴⁰ between the buildings (e.g., street canyon width) limits shading and leads to

⁵⁴⁰ between the buildings (e.g., street early on which) must shading and reads to ⁵⁴¹ higher \dot{q}_F compared to the real morphology. This mechanism affects also \dot{q}_G ,

 $_{542}$ $\,$ which has a higher value for the realistic morphologies due to the aggregation

⁵⁴³ of buildings, which allows the ground to absorb more direct solar radiation in ⁵⁴⁴ unshaded streets and central squares.

For LCZ9 with pitched roofs (Fig. 18), \dot{q}_R is higher for the real morphology than for the simplified morphologies (with flat roofs) for γ below 30°. \dot{q}_F is also lower because the pitched roofs of the real morphology intercept more solar radiation than the flat roofs of the simplified morphologies. For γ below 30°, the urban solar radiation budget is strongly different between the LCZ9 with flat and pitched roofs.

For LCZ2a with pitched roofs (Fig. 19), \dot{q}_R is lower for the simplified mor-551 phologies than for the real morphology; the underestimation increases with 552 lower γ and reaches 25% for $\gamma = 1^{\circ}$. Thus, \dot{q}_F is overestimated by the simpli-553 fied morphologies. \dot{q}_U is slightly higher for the simplified morphologies than 554 for the real morphologies for γ below 45° and is only slightly different above. 555 For LCZ2a with flat roofs (Fig. 20), \dot{q}_B is considerably lower and \dot{q}_F higher 556 for lower solar elevation angle compared to LCZ2a with pitched roofs, while 557 \dot{q}_U and \dot{q}_G do not differ much between the flat and pitched roof morphologies. 558 For LCZ1 (Fig. 3), the simplified urban morphologies with uniform building 559 height overestimate \dot{q}_R for γ below 75° because in the real morphology the 560 heterogeneity of building heights leads to shading of the roofs. The overesti-561 mation is 30% for $\gamma = 45^{\circ}$ and increases to 400% for $\gamma = 1^{\circ}$. Thus, street 562 canyon and block morphologies overestimate \dot{q}_U by 10% for $\gamma = 45^{\circ}$ and up to 563 25% for $\gamma = 1^{\circ}$ because too much radiation is reflected off the roof to the sky. 564 In addition, \dot{q}_F is underestimated by the street canyon and block morpholo-565 gies for γ below 50°, which is due to the overestimation of \dot{q}_R and \dot{q}_U . For γ 566 above 50°, \dot{q}_F is overestimated by the street canyon and block morphologies 567 due to the greater distance between building facades compared to the realistic 568 morphology, which underestimates shading between buildings. \dot{q}_G is underes-569 timated by the simplified morphologies for all solar elevation angles. 570

The overall results for the other urban morphologies show that \dot{q}_F is overesti-571 mated by the infinitely-long street canyon and regular block morphologies for 572 a range of γ that depends on the morphologies' λ_p and H_{mean} . For the mid-rise 573 morphologies LCZ2b (Figs. 21-22), LCZ5 (Figs. 23-24), and LCZ10 (Fig. 25), 574 the overestimation of \dot{q}_F is found for γ between 20° and 50°. For the low-rise 575 morphologies LCZ3 (Fig. 26), LCZ6a (Figs. 27-28), LCZ6b (Figs. 29-30), and 576 LCZ8 (Fig. 31), \dot{q}_F is overestimated for γ between 5° and 30°, and for the 577 high-rise LCZ4 (Fig. 32) it is overestimated for γ between 20° and 70°. This 578 is due to the fact that the higher and denser the urban morphology, the more 579 shadow is cast by a given building on the facades of other buildings, even for 580

high values of γ . This shading is systematically underestimated by the sim-581 plified morphologies resulting in too high values of \dot{q}_F . The uncertainties in 582 \dot{q}_G are complementary to those of \dot{q}_F , i.e. they are underestimated in similar 583 ranges of γ than \dot{q}_F is overestimated. For low values of γ , the results for the 584 flat roof and the corresponding pitched roof morphology are very different. 585 For the flat roof, \dot{q}_R decreases for lower γ while it increases for the pitched 586 roof morphology. As a complement, \dot{q}_F increases for lower γ for the flat roof 587 morphology and decreases for the pitched roof morphology. The street canyon 588 and regular block morphologies have in common that \dot{q}_R does not depend on 589 γ , so they can neither represent the shading of higher buildings on the roofs 590 of lower buildings, nor the potential effect of the pitched roofs. The effective 591 urban albedo (\dot{q}_{II}) is the parameter that is the least affected by the simplifi-592 cation of urban morphology. 593 Figure 4 shows the radiation budget of LCZ2a and LCZ9 districts with flat and 594 pitched roofs for diffusive-only downwelling solar radiation. The results for the 595 other morphologies are shown in supplementary Figs. 33-35. The results are 596 mainly similar to those for the direct-only solar radiation averaged for all val-597 ues of γ . For example, for LCZ1 and direct-only downwelling solar radiation, 598 \dot{q}_G is underestimated for all values of γ when using the infinitely-long street 599 canyon and regular block morphologies. As a consequence, \dot{q}_G is also underes-600

timated for the diffusive-only downwelling solar radiation. For other radiative observables and morphologies, errors of different sign for different values of γ

⁶⁰³ are partly compensated for. Therefore, the results for the diffusive-only solar

radiation are less affected by the simplification of the urban morphology than those for the direct-only solar radiation.

607 6.2 Influence of Spectrally-reflecting Materials

The differences in the simulated solar radiation budget between the morpholo-608 gies with spectrally-reflecting and broadband materials tend to be small. For 609 direct-only downwelling solar radiation and low-rise morphologies, the relative 610 differences are less than 0.8%. For the mid-rise morphologies they are below 611 1%, except for LCZ2a where they reach 2% for \dot{q}_U and \dot{q}_G . Figure 5 shows 612 the results for LCZ1 where the largest differences are found. For LCZ1 with 613 spectrally-reflecting materials, \dot{q}_U is up to 2% lower than for LCZ1 with broad-614 band materials, while \dot{q}_F is up to 2% higher. For diffusive-only downwelling 615 solar radiation, the differences in results between the spectral and broadband 616 materials are very small. The largest relative uncertainty of 1.3% is found for 617 LCZ1 (not shown). 618

619

⁶⁰⁶



Fig. 3 Effect of urban morphology simplifications on the urban, roof, facade, and ground solar radiation budgets for direct-only downwelling solar radiation and the LCZ1 morphology. The values of σ_{max} indicate the maximum value of the standard deviation of the radiative observable obtained from the MCM simulations for all values of γ

620 6.3 Influence of Specular Reflections by Windows

The Tab. 4 shows the values of the effective broadband window glass pane albedo ($\alpha_{win,Lam}$) calculated according to Eq. 14 for each urban morphology

and γ . The values are low (between 0.06 and 0.1) for γ between 1° and 45°.



Fig. 4 Effect of urban morphology simplifications on the urban, roof, facade, and ground solar radiation budgets of selected morphologies and for diffusive-only downwelling solar radiation

This is due to the high angle of incidence of direct solar radiation on the windows. For γ equal to 60° and 75°, $\alpha_{win,Lam}$ is higher (up to 0.28 for $\gamma =$ 75° and the CBD morphology), which is due to the lower angle of incidence of direct solar radiation on the windows. For $\gamma = 90^{\circ}$, no direct solar radiation reaches the windows. Therefore, the values of $\alpha_{win,Lam}$ are lower (0.09 to



Fig. 5 Impact of spectrally-reflecting urban materials on the urban, roof, facade, and ground solar radiation budgets for direct-only downwelling solar radiation and the realistic LCZ1 morphology

629 0.11).

Figure 6 shows the urban solar radiation budget of the CBD for clear-sky conditions, and the results for the other morphologies are shown in supplementary Figs. 36-38. For all morphologies, consideration of windows leads to a decrease in \dot{q}_U and an increase in \dot{q}_F . This is due to the low albedo of the window compared to the C006 wall material. The values of \dot{q}_R and \dot{q}_G are less

γ [°]	1	5	10	20	30	45	60	75	90
LCZ1	0.08	0.08	0.07	0.06	0.08	0.09	0.12	0.19	0.09
LCZ2a	0.08	0.07	0.08	0.08	0.08	0.09	0.13	0.21	0.09
LCZ9	0.06	0.07	0.07	0.07	0.07	0.09	0.12	0.18	0.08
CBD	0.10	0.08	0.08	0.08	0.09	0.11	0.16	0.28	0.11

Table 4 Effective broadband Lambertian albedo of windows

affected by the presence of windows, except for the CBD with its very high 635 glazing ratio ($f_q = 0.9$). Specularly-reflecting windows lead to a lower \dot{q}_U than 636 Lambertian windows, except for $\gamma = 90^{\circ}$, where almost no direct solar radia-637 tion reaches the windows. The reason for this is that the specularly-reflected 638 solar radiation propagates downwards whereas the diffusively-reflected solar 639 radiation is travels upwards or downwards with the same probability. \dot{q}_F and 640 \dot{q}_G are slightly higher for the specularly-reflecting windows. For the morpholo-641 gies with normal glazing ratio ($f_g = 0.3$), the relative differences between the 642 results for specular and Lambertian windows are small (1.5%) for LCZ9, 1.3%643 for LCZ2a, and 3% for LCZ1). Only for CBD with $f_g = 0.9$, the differences 644 are larger (e.g., \dot{q}_U is 10% to 50% lower for specularly-reflecting windows). 645

646 6.4 Influence of Participating Atmosphere in the Urban Canopy Layer

Figure 7 shows the urban terrestrial radiation budget with participating atmo-647 sphere in the urban canopy layer (Atm case) and without (Vac case) for the 648 warmest (TRO) and the coldest (SAW) atmospheric profiles and $\Delta T_{surf} =$ 649 -10 K or +20 K. The other results are shown in the supplementary Figs. 39-650 41. The differences in the terrestrial urban radiation budget between the Vac 651 and Atm cases tend to be larger for those urban morphologies with large build-652 ing height (LCZ1 and LCZ4) and are also strongly dependent on the ΔT_{surf} . 653 When urban surfaces are 10 K colder than the air temperature, \dot{E}_{sky} is less 654 negative for Atm than for Vac, because the warmer air emits more radiation 655 towards the sky than the colder urban surfaces. E_{sky} is also more negative 656 for SAW than for TRO because there is less participation of the colder SAW 657 air than of the warmer TRO air. For $\Delta T_{surf} = 0$ K, the differences between 658 Atm and Vac are small, which is not surprising. When the urban skin surface 659 temperature is higher than the air temperature, E_{sky} is less negative for Atm 660 than for Vac because some of the radiation emitted by the warm urban sur-661 faces is absorbed by the cold air in the UCL and therefore does not reach the 662 atmosphere above the urban canopy layer. The values of E_{sky} are more nega-663 tive for the SAW profile than for the TRO profile, because the cold SAW air 664 participates less in radiative exchange than the warm TRO air. E_F is higher 665 for Atm than for Vac because the cold air between the facades absorbs part 666 of the radiation emitted by the facades leading to a lower value of incident 667 terrestrial radiation at the facades. The differences in E_R and E_G between the 668 Vac and Atm cases remain small, even for the highest ΔT_{surf} of 30 K. 669



Fig. 6 Effect of (specularly-reflecting) windows on the urban, roof, facade, and ground solar radiation budget for clear-sky conditions and the realistic CBD morphology

671 6.5 Influence of Urban Trees

Figure 8 shows the urban solar radiation budget of LCZ9 for the direct-only downwelling solar radiation with and without trees. Results for LCZ2a, LCZ4, and LCZ5 are shown in the supplementary Figs. 42-44. For the sparsely-built LCZ9 with $H_{mean} = 5.9$ m, the trees are almost twice as high as the buildings and therefore strongly modify the solar radiation budget. For γ below 10°, the



Fig. 7 Terrestrial radiation exchanged by the sky, the roofs, the facades, the ground, and the air in the urban canopy layer for clear-sky tropical and sub-arctic winter atmosphere with (Atm) and without (Vac) participating atmosphere in the urban canopy layer. The names of the realistic LCZ morphologies are abbreviated: L1 is LCZ1, etc.

trees cast shade on the roofs, leading to a large reduction in \dot{q}_R . For γ above 677 45°, the trees absorb (\dot{q}_T) about 10% of the downwelling solar radiation, and 678 this fraction increases to more than 50% for a γ of 1°. The radiation absorbed 679 by the trees does not reach the facades (mainly for low γ) or the ground (mainly 680 for high γ). The presence of trees lowers \dot{q}_U due to the multiple reflections by 681 the leaves. For LCZ5, the buildings are taller than the trees, so the trees do not 682 change the \dot{q}_R . The fraction of solar radiation absorbed by the trees decreases 683 for γ below 10° because the buildings shade the trees. The trees slightly reduce 684 \dot{q}_F and \dot{q}_G for all values of γ . For the denser LCZ2a and the open high-rise 685

686 LCZ4, the main results are similar to those for LCZ5.

has no effect on \dot{q}_R for LCZ9, contrary to the result for direct-only downwelling

- solar radiation. The other results are similar to those for direct-only radiation.
- ⁶⁹⁰ The trees reduce \dot{q}_F , \dot{q}_G , and \dot{q}_U except for LCZ2a, for which they do not have
- ⁶⁹¹ sufficient influence.
- ⁶⁹² The influence of trees on the urban terrestrial radiation budget is shown in
- $_{\rm 693}$ $\,$ Fig. 10. The trees do not change the radiative observables much, the only
- exception being E_{sky} , which is lower when trees are present, as the urban morphology with trees has a higher total surface area resulting in a higher
- effective emissivity.
- 696 Figure 11 shows a $1 \text{ m} \times 1 \text{ m}$ resolution map of MRT for the LCZ9 district with 697 and without trees. The top row shows the MRT calculated with the solar and 698 terrestrial radiation contributions ($\gamma = 30^{\circ}$, the solar azimuth angle is 292.5° from north, clockwise) and the skin surface temperature of all urban facets 700 including the trees is 304.2 K. The bottom row shows the MRT calculated 701 with only the terrestrial radiation contribution (nighttime conditions). During 702 the day, the MRT is between 49 and 57°C in the sunlit areas far from buildings, 703 between 17 and 25°C in the areas shaded by buildings, and up to 62°C near 704 the sunlit building walls, which is due to the solar radiation reflected by the 705 building walls. The trees lead to a strong MRT reduction of 10 K in the 706 partially-shaded areas and 30 K in the fully-shaded areas. Considering that the 707 sensitivity of human thermal comfort indices to MRT is about 0.25 (Schoetter 708 et al. 2013), they would be about 7 to 8 K lower in the fully shaded areas. 709 For the night conditions, MRT is mainly between 13 and $15^{\circ}C$ with only 710 little spatial variation. Trees lead to slightly higher MRT (between 2 and 4 K 711 higher), because they emit more terrestrial radiation than the downwelling 712
- ⁷¹³ terrestrial radiation from the sky that is occulted by the trees.

⁷¹⁴ 6.6 Influence of Urban Fog

The urban solar radiation budget for different liquid water mixing ratios of 715 urban fog is shown in Fig. 12 for LCZ4 and in the supplementary Figs. 45-47 716 for LCZ2a, LCZ5, and LCZ9. The denser the urban fog, the more \dot{q}_U increases 717 and the less it depends on γ . This is because in very dense urban fog, most of 718 the downwelling solar radiation is reflected by the fog layer before it reaches 719 the urban facets. For LCZ9, LCZ5, and LCZ2a, \dot{q}_R is reduced in the presence 720 of urban fog, because the fog reflects and absorbs a part of the downwelling 721 solar radiation before it can reach the roofs of buildings. For LCZ4 and low 722 values of γ , \dot{q}_R is increased in the presence of urban fog. This is because, under 723 clear-sky conditions, some roofs of the LCZ4 morphology are shaded, whereas 724 in the presence of fog, there is more diffuse solar radiation and more of the 725 downwelling radiation at the roof level is actually aborbed by the roofs. For 726 clear-sky conditions, \dot{q}_F is strongly dependent on γ . This is no longer the case 727 in the presence of urban fog. Compared to clear-sky conditions, urban fog 728 leads to a lower \dot{q}_F for low γ and a higher \dot{q}_F for higher γ because less direct 729



Fig. 8 Effect of trees on the urban, roof, facade, ground, and tree solar radiation budgets for direct-only downwelling solar radiation and the realistic LCZ9 morphology



Fig. 9 Effect of trees on the urban, roof, facade, ground, and tree solar radiation budgets for diffusive-only downwelling solar radiation for the realistic LCZ2a, LCZ4, LCZ5, and LCZ9 morphologies

downwelling solar radiation reaches the urban facets. In the presence of urban for, \dot{q}_{G} increases with the solar elevation angle (γ).

105, 4G increases with the solar circulation angle (7):

Figure 13 displays the effect of fog on the terrestrial urban radiation budget
for LCZ4 and supplementary Figs. 48-50 for LCZ2a, LCZ5, and LCZ9. For the

 $_{734}$ clear-sky conditions, the urban area emits radiation towards the sky (E_{Sky} is

⁷³⁵ negative) and more radiation is emitted with increasing ΔT_{surf} . In the pres-⁷³⁶ ence of urban fog, the urban terrestrial radiation budget is markedly changed.

ence of urban fog, the urban terrestrial radiation budget is markedly changed.
 The denser the urban fog, the less radiation is exchanged with the sky. For an

The denser the urban fog, the less radiation is exchanged with the sky. For an urban fog with a density of 0.5 g kg^{-1} or higher, only very little radiation is

exchanged between the urban surfaces and the sky. The emission from roofs,

facades, and ground still increases with increasing ΔT_{surf} , but the value of

⁷⁴¹ the emission is lower because there is almost no emission to the sky. Instead,

⁷⁴² the urban facets exchange radiation with the urban fog.



Fig. 10 Effect of trees on the longwave radiation exchanged by the sky, the roofs, the facades, the ground, and the trees for the realistic LCZ2a, LCZ4, LCZ5, and LCZ9 morphologies. In the legend, Tr denotes the urban district with trees (cross), Nt the urban district without trees (circle)

743 7 Discussion

The main findings obtained of the MCM-based sensitivity studies are as follows:

The simplified urban morphologies infinitely-long street canyon and regular
 square blocks, which are very often used in urban canopy models, lead to a
 systematic overestimation (underestimation) of the fraction of direct solar
 radiation absorbed by the building facades (the ground). This is because



Fig. 11 Map at 1 m resolution of the daytime and night-time MRT of a realistic LCZ9 morphology with and without trees. The solar elevation angle is 30° and the solar azimuth angle is 292.5° from north clockwise. The areas covered by buildings are white

these morphologies cannot represent buildings that are closer to each other
than the width of the street canyon or the distance between the square
blocks. For mid- and high-rise urban morphologies, the uncertainty in the
radiation absorbed by the facades can be more than 10% of the downwelling
direct solar radiation. As a consequence, the partitioning of the surfaceatmosphere exchanges between the building envelope and the ground is
incorrect, which can affect the results of urban canopy models.

There is only little difference between the results obtained for the infinitely long street canyon and the regular array of square block morphologies. An
 interesting point is that the square blocks do not perform better than
 the infinitely-long street canyon for urban morphologies such as LCZ4 or
 LCZ9, which are more like blocks than like canyons. This is because for



Fig. 12 Effect of fog on the urban, roof, facade, and ground direct solar radiation budget for the realistic LCZ4 morphology $\,$

both square blocks and street canyon, there is a minimum distance between
the geometric elements, which does not exist in a realistic morphology.

- Simplified morphologies that neglect the variety of building heights lead to
 large uncertainties for the high-rise LCZ1 and LCZ4. Therefore, the use of
 more sophisticated approaches is advised for the simulation of cities where
 such morphologies are common (e.g., Asian megacities).

The simplification of the urban morphology leads to greater uncertainties
 when considering direct solar radiation compared to diffuse solar radiation.



Fig. 13 Effect of fog on the terrestrial radiation exchanged by the sky, the roofs, the facades, and the ground for the realistic LCZ4 morphology

At low angles of solar elevation, pitched roofs greatly alter the urban direct 770 solar radiation budget. With pitched roofs, more solar radiation is absorbed 771 by the roofs and less by the facades. As urban canopy models neglect 772 pitched roofs, this is a major source of uncertainty, especially in subartic 773 regions where the solar elevation angle is typically low. This result has to be 774 modulated because the absolute values of downwelling solar radiation are 775 small at low solar elevation angles and therefore, large relative uncertainties 776 in the radiative observables may not lead to a large absolute uncertainty 777 in the simulated urban radiation budget. 778

The effective city albedo is the parameter that is the least affected by
the simplification of the urban morpholoy. Therefore, less sophisticated
approaches to represent the city could be used if the focus is only on the
effective city albedo for the coupling with the atmospheric model.

The uncertainty in the urban solar radiation budget introduced by the
 use of broadband compared to spectral reflectivity of urban materials is
 small. Larger uncertainties may be found for radiative observables that are
 defined for a narrow band of the solar spectrum such as photosynthetically
 active radiation or ultraviolet radiation.

- Specular reflections from windows alter the urban solar radiation budget 788 in a relevant manner only in the CBD district with a very high glazing 789 ratio. The main reason for this is that the fraction of radiation that is 790 reflected by windows is quite low (between 0.06 and 0.28 depending on 791 solar elevation angle). Therefore, for the urban radiation budget, it does 792 not make much difference whether the reflection is Lambertian or specular. 793 The previous study by Aida and Gotoh (1982) found a large influence 794 of specular reflections on urban albedo. This is because in their study, 795 all urban surfaces were considered as specular reflectors, whereas in the 796 present study, only the windows are specular reflectors. Effects of specular 797 reflections may be greater for urban districts with specularly reflecting wall 798 materials or window coatings with a higher albedo. 799
- The interaction between terrestrial radiation and clear air in the urban 800 canopy layer strongly modifies the urban radiation budget. The higher the 801 buildings, the more relevant the participating atmosphere becomes. For 802 the high-rise LCZ1 and skin surface temperature 20 K higher than the air 803 temperature, the radiation exchanged by the facades is almost a factor of 804 two higher with the participating atmosphere than without. This could 805 strongly change the energy balance of the building or the sensible heat flux 806 from the facades to the atmosphere. Such findings are in line with those 807 of Hogan (2019b). It is therefore problematic that urban canopy models 808 usually do not take into account the participating atmosphere. In warmer 809 and more humid climates where many high-rise megacities are located, 810 the participating atmosphere has a greater effect than in colder or drier 811 climates. 812
- Urban trees have a very large influence on the solar radiation budget if they
 are higher than the buildings. Therefore, urban canopy models including
 urban trees should be designed to be able to account for trees that are
 taller than the buildings.
- The presence of fog strongly alters both the solar and terrestrial radiation
 budgets of urban areas. Therefore it may be interesting to extend urban
 canopy models so that they can represent urban fog and aerosols.
- Several systematic drawbacks and limitations of the present study need to be
 mentioned.
- Only idealised procedurally-generated urban morphologies have been investigated. Although key morphology parameters such as λ_p and H_{mean}

have been chosen to match the typical values for the LCZ given in Stewart and Oke (2012), there may be systematic differences between the idealised morphologies and real cities. This could be the p_{ww} and p_{wg} , the omission of overhanging roofs, balconies, etc..

The urban morphologies studied are designed to represent one building
 type per district; the type of LCZ is clearly defined. In real cities, there are
 districts with a mix of building types, which has not been investigated in
 this study.

The effect of heterogeneous urban materials and skin surface temperature
has not been investigated. For example, half of the roofs could be bright
brick tiles and the other half dark slate, whereas an urban canopy model
would only solve the urban energy balance using the most common material, or average the parameters.

The present study did not investigate the climatology of uncertainties of
urban canopy models. For exemple, the uncertainty due to the neglect
of pitched roofs, which was found for low solar elevation angles is more
relevant for cities at high latitude than for tropical cities.

In the present study, the radiative observables have been averaged for all solar azimuth angles. In a real-world application, there is a specific position of the sun, but the urban canopy model may still be averaging all solar azimuths. This adds another uncertainty, which has not been quantified here.

846 8 Conclusion and Outlook

The present study has investigated the uncertainties of radiative transfer cal-847 culation in urban canopy models. Urban districts similar to the LCZ have been 848 created using a procedural city generator. A reference MCM model of urban 849 radiative transfer is used to quantify the uncertainties arising from simplifi-850 cations of urban morphology and radiative transfer physics that are typically 851 made in urban canopy models. These assume that the complex urban morphol-852 ogy can be represented by an infinitely-long street canyon or regular square 853 blocks, that urban materials are broadband Lambertian reflectors, and that at-854 mospheric participation in radiative exchange in the urban canopy layer can be 855 neglected. The results of the present study allow one to identify some priorities 856 for the future development of urban canopy models. For all urban morpholo-857 gies, the street canyon and block geometries lead to a wrong partitioning of 858 solar radiative energy between the facades and the ground, as they lead to 859 a systematic underestimation of inter-building shading. Therefore, the urban 860 geometry proposed by Hogan (2019a), which assumes an exponential distribu-861 tion of p_{ww} and p_{wg} is promising. Pitched roofs should also be considered in 862 future urban canopy models. The inclusion of a variety of building heights at 863 grid-point scale is necessary for high-rise or very heterogeneous urban districts. 864 Future urban canopy models should take into account the participating atmo-865 sphere in the urban canopy layer for the calculation of the urban terrestrial 866
⁸⁶⁷ radiation budget. Representation of spectral reflectivities of urban materials

 $_{\tt 868}$ $\,$ and specular reflections is of lower priority since they only modify the urban

- ⁸⁶⁹ radiation budget for urban morphologies and building materials, which do not
- 870 occur frequently.

In future studies, HTRDR-Urban could be used to investigate meteorologi-871 cal situations with urban air pollution, urban districts with different types of 872 trees, windows with different coatings, districts with heterogeneous materials 873 and building types, or uneven ground. The results of the present study to-874 gether with those of Hogan (2019a) are the motivation to couple the urban 875 canopy model Town Energy Balance (TEB, Masson (2000)) with the new ur-876 ban radiation scheme SPARTACUS-Urban (Hogan 2019b), which allows to 877 overcome most of the shortcomings of radiation transfer calculations in urban 878

⁸⁷⁹ canopy models identified in the present study.

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9 Declarations

- 884 9.1 Ethical Approval
- ⁸⁸⁵ This declaration is not applicable.
- 886 9.2 Competing interests
- ⁸⁸⁷ The authors declare no competing interest.

888 9.3 Authors' contributions

⁸⁸⁹ Conceptualization: Robert Schoetter, Robin Hogan, Valéry Masson; Method⁸⁹⁰ ology: Robert Schoetter, Cyril Caliot, Tin-Yuet Chung, Robin Hogan, Valéry
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⁸⁹² Tin-Yuet Chung, Robin Hogan, Valéry Masson; Writing - original draft preparation: Robert Schoetter, Cyril Caliot, Tin-Yuet Chung; Writing - review and
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⁸⁹⁵ Masson; Project administration: Robert Schoetter, Cyril Caliot; Funding ac-

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9.5 Availability of data and materials 902

The new HTRDR-Urban code package for solar and infrared radiative flux 903

computations associated with the current submission is publicly available at 904

https://gitlab.com/edstar/htrdr/-/tree/main_urban. 905

The scripts to launch and postprocess the HTRDR-Urban simulations that 906

are presented here are available on request. 907

Appendix 1: List of symbols 908

The list of symbols is given in Table 5. 909

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- Supplementary Material For *Boundary-Layer Meteorology* Uncer tainties of Radiative Transfer Calculation in Urban Canopy Models
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1234 1 Supplementary Figures

- 1235 1.1 Distribution of Wall-to-wall and Wall-to-ground Distances
- 1236 1.2 Simplification of Urban Morphology
- 1237 1.3 Influence of Spectrally-reflecting Windows
- 1238 1.4 Influence of Participating Atmosphere in the Urban Canopy Layer
- 1239 1.5 Influence of Trees on the Urban Radiation Budget
- 1240 1.6 Influence of Fog on the Urban Radiation Budget



Fig. 14 Distribution of wall-to-wall (p_{ww}) and wall-to-ground (p_{wg}) distances for the urban morphologies LCZ1, LCZ2b, and LCZ3



Fig. 15 Same as Fig. 14, but for the urban morphologies LCZ5, LCZ6a, and LCZ6b



Fig. 16 Same as Fig. 15, but for the urban morphologies LCZ8, and LCZ10 $\,$

Table 5 List of symbols	Table	5	List	of	sym	\mathbf{bols}	
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Symbol	Definition [unit]
α	Solar reflectivity (albedo) [1]
α_{body}	Average albedo of the human body [1]
α_{eff}	Effective broadband albedo [1]
$\alpha_{win,Lam}$	Effective broadband Lambertian window albedo [1]
Adistrict	Total horizontal area of district [m ⁻]
A_n	Footprint area of building $n [m^2]$
AF_n	External facade area of building n [II ⁻]
ΔI_{surf}	Enjosivity of torrectrial radiation [1]
e 6	Average emissivity of the human body [1]
ebody E	Therefore realization exchanged by the air in the urban canony layer $[W m^{-2}]$
\dot{E}_{air}	Terrestrial radiation exchanged by the air in the urban canopy layer [W in]
\dot{E}_{F}	Terrestrial radiation exchanged by the facades [W m ^{-2}]
E_G \dot{E}	Temestrial radiation exchanged by the ground $[W m^{-2}]$
E_R	The matrix is a state of the set
\dot{E}_{sky}	The sector is the sector of the sector $[W = 2]$
	Ferencial radiation exchanged by the trees [w m -]
Jg	Facade glazing ratio [1]
Υ H	Maximum building height [m]
H_{max}	Mean building height [m]
H_n	Height of building n [m]
$\underline{\underline{H}}$	Aspect ratio of representative street canyon [1]
W	Solar flux density incident on a facet $[W m^{-2}]$
I facet	Solar flux density incident on a mean larly reflecting window $[W m^{-2}]$
win, spec	Extinction coefficient $[m^{-1}]$
λ λ	Plane area building density [1]
λ_p	External facade surface density [1]
laida	Side length of one regular square block [m]
ltotal	Side length of a plot with one regular square block [m]
L	Cumulative index of building surface area [m]
LW_{down}	Downwelling terrestrial radiation at the surface $[W m^{-2}]$
LW_{net}	Net exchanged terrestrial radiation at the surface $[W m^{-2}]$
N_{build}	Total number of buildings in district [1]
N_{f}	Number of facets in urban geometry [1]
N_{γ}	Number of Monte Carlo realisations for a solar elevation angle of γ [1]
N_l	Number of layers in the urban canopy model [1]
N_{stream}	Number of streams per hemisphere employed in the Discrete Ordinates Method [1]
N_{zen}	Number of Monte Carlo realisations for $\gamma = 90^{\circ}$ [1]
p_{wg}	Probability distribution of wall-to-ground distance [1]
p_{ww}	Probability distribution of wall-to-wall distance [1]
Q_{air}	Solar flux density absorbed by the air in the urban canopy layer $[W m^{-2}]$
\dot{q}_{air}	Q_{air} normalised by Q_D [1]
$Q_{\rm body,sw}$	Average solar flux density incident on the human body $[W m^{-2}]$
$Q_{\rm body, lw}$	Average terrestrial flux density incident on the human body $[W m^{-2}]$
Q_D	Downwelling solar flux density at the top of the urban canopy layer $[W m^{-2}]$
Q_{facet}	Solar flux density absorbed by a facet $[W m^{-2}]$
Q_F	Solar flux density absorbed by the facades $[W m^{-2}]$
\dot{q}_F	Q_F normalised by Q_D [1]
Q_G	Solar flux density absorbed by the ground $[W m^{-2}]$
\dot{q}_G	Q_G normalised by Q_D [1]
Q_R	Solar flux density absorbed by the roofs $[W m^{-2}]$
\dot{q}_R	Q_R normalised by Q_D [1]
Q_T	Solar flux density absorbed by the trees $[W m^{-2}]$
\dot{q}_T	\dot{Q}_T normalised by \dot{Q}_D [1]
Q_U	Upwelling solar flux density at the top of the urban canopy layer $[W m^{-2}]$
\dot{q}_U	\dot{Q}_U normalised by \dot{Q}_D [1]
$\dot{Q}_{win,spec}$	Solar flux density absorbed by a specularly reflecting window $[W m^{-2}]$
R_{net}	Net all-wave radiation $[W m^{-2}]$
σ	Stefan-Boltzmann constant $[W m^{-2}]$
σ_H	Standard deviation of building height [m]
σ_{max}	Largest value of the standard deviation of normalised Monte Carlo observables [1]
SW_{down}	Downwelling solar radiation at the surface $[W m^{-2}]$
SW_{net}	Net absorbed solar radiation at the surface $[W m^{-2}]$
1 _s	Skin surface temperature [K]
z ~	neight above ground [m] Height of the unbergeneration [m]
$\sim top$	neight of the urban canopy layer top [III]



Fig. 17 Effect of urban morphology simplifications on the urban, roof, facade, and ground solar radiation budget for direct-only downwelling solar radiation and the LCZ9 morphology with flat roofs. The values of σ_{max} indicate the highest value of the standard deviation of the radiative observable obtained from the MCM simulations for all values of γ



Fig. 18 Same as Fig. 17, but for LCZ9 with pitched roofs



Fig. 19 Same as Fig. 17, but for LCZ2a with pitched roofs



Fig. 20 Same as Fig. 17, but for the LCZ2a morphology with flat roofs.



Fig. 21 Same as Fig. 17, but for LCZ2b with flat roofs



Fig. 22 Same as Fig. 17, but for LCZ2b with pitched roofs



Fig. 23 Same as Fig. 17, but for LCZ5 with flat roofs



Fig. 24 Same as Fig. 17, but for LCZ5 with pitched roofs



Fig. 25 Same as Fig. 17, but for LCZ10



Fig. 26 Same as Fig. 17, but for LCZ3



Fig. 27 Same as Fig. 17, but for LCZ6a with flat roofs



Fig. 28 Same as Fig. 17, but for LCZ6a with pitched roofs



Fig. 29 Same as Fig. 17, but for LCZ6b with flat roofs



Fig. 30 Same as Fig. 17, but for LCZ6b with pitched roofs





Fig. 32 Same as Fig. 17, but for LCZ4



Fig. 33 Effect of urban morphology simplifications on the urban, roof, facade, and ground solar radiation budget for diffusive-only downwelling solar radiation and the LCZ1, LCZ3, LCZ4, and LCZ8 districts



Fig. 34 Same as Fig. 33, but for the LCZ2b and LCZ5 districts with flat and pitched roofs



Fig. 35 Same as Fig. 33, but for the LCZ6a and LCZ6b districts with flat and pitched roofs as well as the LCZ10 district



Fig. 36 Effect of (specularly-reflecting) windows on the urban, roof, facade, and ground solar radiation budget for clear-sky conditions and the realistic LCZ9 morphology



Fig. 37 Same as Fig. 36, but for the realistic LCZ2a morphology



Fig. 38 Same as Fig. 36, but for the realistic LCZ1 morphology


Fig. 39 Effect of participating atmosphere on the terrestrial radiation exchanged by the sky, the roofs, the facades, the ground, and the air for clear-sky tropical for the realistic LCZ morphologies and sub-arctic winter atmospheres



Fig. 40 Same as Fig. 39, but for clear-sky mid-latitude summer and winter atmospheres



Fig. 41 Same as Fig. 40, but for different skin surface temperature of urban facets $% \left[{{{\mathbf{F}}_{{\mathbf{F}}}} \right]$



Fig. 42 Effect of trees on the urban, roof, facade, ground, and tree solar radiation budget for direct-only downwelling solar radiation and the realistic LCZ2a morphology



Fig. 43 Same as Fig. 42, but for the realistic LCZ4 morphology



Fig. 44 Same as Fig. 42, but for the realistic LCZ5 morphology



Fig. 45 Effect of fog on the urban, roof, facade, and ground solar radiation budget for the realistic LCZ2a morphology



Fig. 46 Same as Fig. 45, but for the realistic LCZ5 morphology



Fig. 47 Same as Fig. 45, but for the realistic LCZ9 morphology



Fig. 48 Effect of fog on the terrestrial radiation exchanged by the sky, the roofs, the facades, and the ground for the realistic LCZ2a morphology



Fig. 49 Same as Fig. 48, but for the realistic LCZ5 morphology



Fig. 50 Same as Fig. 48, but for the realistic LCZ9 morphology