# **Study and prediction of the energy interactions between buildings and the urban climate**

**by**

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Submitted to the Department of Architecture in Partial Fulfillment of the Requirements for the Degree of

# Doctor of Philosophy in Architecture: Building Technology

at the

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# **Study and prediction of the energy interactions between buildings and the urban climate**

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Bruno Bueno Unzeta

Submitted to the Department of Architecture on June **29,** 2012 in Partial Fulfillment of the Requirements for the Degree of Doctor of Philosophy in Architecture: Building Technology

#### *Abstract*

Urbanization produces higher air temperatures in cities than in the undeveloped rural surroundings. This phenomenon is known as the Urban Heat Island **(UHI)** effect and has been measured in different cities around the world. Conventional building energy programs use standard meteorological databases obtained from measurements at operational weather stations, which are usually located in open areas outside of the city, typically at the airport. Therefore, air temperature measurements may not include the **UHI** effect.

The **UHI** effect can have an impact on the energy consumption of buildings, especially residential and naturally ventilated buildings. At the same time, the energy performance of buildings can affect outdoor air temperatures, mainly through the waste heat emissions from outdoor air-conditioning equipment. Consequently, there are situations in which the interactions between the indoor and outdoor environments are reciprocal and thus both domains have to be solved simultaneously.

This thesis presents a study of the energy interactions between buildings and the urban climate through the development and evaluation of a set of models. Based on first principles, these models include three different Urban Canopy and Building Energy Models (UC-BEMs), with different levels of detail and applications, and a novel urban climate prediction tool, the Urban Weather Generator **(UWG).** Developed at the intersection of building energy and urban climate studies, the research builds on fundamental knowledge in both domains.

The UC-BEMs account for building thermal effects on climatological predictions and have the potential to predict building energy consumption at urban scale. The UC-BEMs can be coupled with mesoscale atmospheric simulations, establishing a multi-scale model approach from the atmosphere down to buildings that can be used to analyze the impact of future climate change scenarios on the urban climate and the energy consumption of buildings.

The **UWG** calculates site-specific urban climate conditions from measurements at an operational weather station. The model can be used alone or integrated into existing programs in order to account for the **UHI** effect in building energy simulations. The **UWG** is evaluated with field data from Toulouse, France, and Basel, Switzerland.

Thesis supervisor: Leslie K. Norford Title: Professor of Building Technology

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**I** would like to acknowledge the invaluable contribution of Prof. Rex Britter, whose expertise in the meteorological field solved many of the questions arisen in the exploration of urban climate studies.

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Especially, **I** would like to give my thanks to my wife Kasia whose patient love enabled me to complete this work.

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# **Chapter 1**

# **Introduction**

## **1.1 Context**

This research is motivated **by** the environmental and societal challenges we face in the context of an increasing global population, global warming, and energy scarcity. In particular, it aims to be a step toward the improvement of the sustainability of urban areas, where more than half of the global population currently lives [P.R.B., **2011].**

Urban areas are affected **by** an increase in air temperature relative to the surrounding rural areas, a phenomenon known as the Urban Heat Island (UHI) effect. The UHI effect has been documented based on meteorological experiments carried out in different cities around the world [Roth, **2007;** Hicks et al., **2010;** Lee and Baik, **2010;** Zhou and Shepherd, **2010;** Houet and Pigeon, 2011]. Fig. **1.1** shows the average diurnal cycle of urban and rural air temperature measured in Basel (Switzerland) during the summer of 2002 [Rotach et al., **2005].** The UHI effect has a characteristic diurnal pattern [Oke, **1987],** being more intense at late afternoon and night. In the morning, the urban-rural temperature difference can be negative, what is called the Urban Cool Island effect.



Figure **1.1 -** Monthly-average diurnal cycle of urban and rural air temperatures measured in Basel, Switzerland, between June **10** and July **10,** 2002, during the experiment BUBBLE [Rotach et al., **2005].**

The observed **UHI** effect can be explained **by** the different morphology of the urban terrain relative to the rural terrain. The effective albedo tends to be higher due to the inter-reflections between urban surfaces. Additionally, the urban terrain delays the diurnal cycle of air temperature due to the fact that there is more surface exposed to the environment, increasing the effective thermal inertia [Erell and Williamson, **2007].** Furthermore, urban surface roughness decreases the mean wind velocity and reduces the convective heat removal. Added to this is the heat gain due to anthropogenic sources [Sailor, **2011]** and the lower evaporation due to the reduction of vegetated areas. To analyze the UHI effect, it is useful to differentiate between its mesoscale component, produced **by** the aggregated effect of the city on the urban boundary layer [Kuttler, **2008],** and its canopy-scale component due to the urban canyon effect (Fig. **1.2).**



Figure 1.2 **-** Representation of a city and the components of the **UHI** effect: mesoscale and canopy-scale.

The **UHI** effect can have an impact on the energy consumption of buildings, especially residential and/or naturally ventilated buildings. It increases their cooling energy consumption in summer [Assimakopoulos et al., **2007;** Santamouris et al., 2001] but can also reduce their heating energy consumption in winter [Memon et al., **2011].** In temperate climates, urban design strategies that combine building energy efficiency and urban climate considerations can optimize the energy demand of urban areas. In hot climates, the operation of residential air-conditioning **(AC)** systems is a significant percent of a city's total energy consumption and peak power demand [Rhodes et al., **2011].** Furthermore, **AC** systems are responsible for waste heat emissions that contribute to the **UHI** effect, and their use is expected to increase in the following years as a consequence of global-scale climate warming [Adnot, **2003]** and improving economies in developing countries.

This research has been developed at the intersection between building energy and urban climate studies. Building energy engineering focuses on the indoor environment but requires weather information as boundary conditions for its calculations. On the other hand, urban climatologists are interested in phenomena such as the **UHI** effect, which is partially caused **by** building energy operation. The combination of these two scientific communities can benefit from complementary expertise.

Urban planning also has a crucial role to play for improving urban sustainability. Urban planners have already started to incorporate energy efficiency strategies into the design process of urban areas [Mackey et al., 2012]. However, these initiatives are still tepid or purely experimental. This can be explained **by** the fact that there has not yet been established a clear and trustworthy relationship between urban design alternatives and their energy performance. This research is presented as a step toward developing a solid knowledge of the physical principles that make some design alternatives more sustainable than others. The ultimate goal is to be able to integrate building energy consumption and urban-scale climate warming considerations into the decision-making process of urban design and operation.

## **1.2 Needs**

#### **1.2.1 Building energy engineering**

Building energy simulation programs use standard meteorological databases obtained from measurements at operational weather stations for annual energy calculations. Operational weather stations are usually located in open areas, without nearby obstructions, and outside the city, typically at the airport. Therefore, air temperature measurements might not include the **UHI** effect.

Crawley **[2008]** studies the impact of the UHI effect on a small office building **by** assuming typical diurnal cycles of urban-rural temperature difference. His study suggests that the **UHI** effect modifies the energy consumption of office buildings between *5%* and **10%** (increasing their cooling energy demand in summer and decreasing their heating energy demand in winter). **A** study carried out in this thesis predicts a similar impact of the **UHI** effect on commercial buildings (i.e. office buildings) and concludes that these buildings are less affected than residential buildings **by** this phenomenon because their energy performance is usually dominated **by** internal heat gains. The study shows that the energy demand of residential buildings can be modified **by** 20% for a typical 4 K daily-maximum **UHI** effect.

At the same time as the **UHI** effect modifies the indoor energy operation, the energy performance of buildings can have an impact on outdoor air temperatures, mainly through the waste heat emissions from outdoor **AC** equipment. Consequently, there are situations in which the interactions between the indoor and outdoor environments are reciprocal and thus both domains have to be solved simultaneously.

This thesis proposes an Urban Weather Generator **(UWG)** to calculate urban air temperatures using meteorological information measured at an operational weather station and accounting for the reciprocal interactions between building and the urban climate. Other studies that calculate urban weather information through meteorological modeling can be found in the literature. Erell and Williamson **[2006]** presented a rural-to-urban weather transformation (the **CAT** model) based on the urban canopy model **LUMPS** [Grimmond and Oke, 2002] and the **CTTC** model [Swaid and Hoffman, **1990],** which requires the calibration of empirical parameters at the location of analysis. Oxizidis et al. **[2008]** proposed a computationally expensive method of generating urban weather files **by** coupling EnergyPlus [Crawley et al., 2001] with Computational Fluid Dynamics **(CFD)** and mesoscale atmospheric simulations. The **UWG** overcomes the limitations of previous models.

In urban planning, there is also a demand for building stock models to assist with the implementation of policy. Swan and Ugursal **[2009]** review the various modeling techniques used to estimate the energy consumption at neighborhood or city scale. The top-down approach utilizes historic aggregate energy data, deriving the energy consumption of building stocks as a function of top-level variables such as macroeconomic indicators, energy price, and general climate. Bottom-up models account for the energy consumption of individual end-users and extrapolate it to represent an urban area based on the representative weight of the modeled sample. **A** number of physically-based bottom-up models can be found in the literature [Kavgic et al., 2010]. However, none of these models specifically accounts for the interactions between buildings and the urban environment. The Urban Canopy and Building Energy Models (UC-BEMs) presented in this thesis overcome this limitation and have the potential to become fully-operative building stock models.

#### **1.2.2 Urban climatology**

Different research groups are interested in predicting future climate change scenarios and their implications in the urban climate and the energy consumption of buildings **[CNRM-GAME,** 2010]. This requires a multi-scale model approach from the atmosphere down to buildings.

Urban Canopy Models (UCMs) have been developed to represent urbanized surfaces in atmospheric numerical simulations and are being used as urban-climate prediction tools. The Town Energy Balance (TEB) scheme [Masson, 2000] is a well-established example of a physically-based **UCM** [Masson and Grimmond, 2002; Lemonsu et al., 2004; Pigeon et al., **2008].** The TEB scheme is based on a twodimensional approximation of an urban canyon (Fig. **1.3)** formed **by** three generic surfaces: a wall, a road, and a roof. The urban canyon air is represented as a well-mixed thermal zone that exchanges heat with the generic wall, the generic road, and the atmosphere above the urban canopy layer. The generic roof exchanges heat directly with the atmosphere. Further developments of the TEB scheme divide the urban canyon in multiple horizontal layers [Hamdi and Masson, **2008].**





Previous versions of the TEB model implement a simple representation of building energy processes, which did not include important features such as internal heat gains or infiltration. In order to improve the representation of buildings in TEB, this thesis proposes two different approaches.

The first approach is to couple EnergyPlus with TEB. The Coupled Scheme **(CS)** presented in this thesis makes it possible to analyze the effect on urban climate of all building parameters included in a detailed building model. It also enables the identification of building configurations whose analysis and design are more sensitive to urban climate conditions. Furthermore, taking advantage of the previous evaluations of EnergyPlus, the **CS** can be used in the evaluation process of new models. However, the scheme requires a number of iterations between EnergyPlus and TEB, which makes it unsuitable for coupling with atmospheric models.

The second approach is to develop a new building energy model integrated in the urban canopy model. This is the method used **by** Kikegawa et al. **[2003]** and Salamanca et al. [2010]. They developed -simplified building energy models that are able to capture the main heat transfer processes that occur inside buildings and to calculate building energy demand and waste heat emissions from **AC** systems [Kondo and Kikegawa, **2003;** Salamanca and Martilli, 2010; Kikegawa et al., **2006;** Ihara et al., **2008].** However, their models do not include active and passive building systems, which are sometimes necessary to get a good estimation of building energy consumption. Furthermore, active and passive system

models allow for an evaluation of the impact of energy efficiency strategies on climate. The new building energy model integrated in TEB overcomes the limitations of previous models.

UCMs can be coupled with a mesoscale atmospheric model (on-line approach) or forced with meteorological information above the urban canopy layer (off-line approach) [Masson and Seity, **2009].** The off-line approach takes advantage of the low computational cost of UCMs in order to effectively perform parametric analyses of urban design criteria. However, this approach generally assumes that forcing conditions (i.e. boundary conditions) are not affected **by** changes in the urban surface, which is a restrictive assumption if one is interested in contrasted scenarios of urban heat fluxes. Furthermore, forcing meteorological information above the urban canopy layer is only available through short-term experiments, a few permanent urban stations, and mesoscale simulation results. This limits the use of **UCM by** other communities, such as building engineers and urban planners, who may be interested in urban climate prediction but do not have access to this type of information. On the other hand, meteorological information can be easily found in weather data files obtained from measurements at operational weather stations located in open areas outside the city.

The atmospheric component of the **UWG,** developed in this thesis, calculates air temperatures above the urban canopy layer from measurements at an operational weather station. Previous studies also aimed to estimate the mesoscale **UHI** effect. Based on similarity theory, Hidalgo et al. **[2009]** developed a correlation for the daytime **UHI** effect at mesoscale level. Previously, Lu et al. **[1997]** had proposed an equivalent correlation for the nighttime case. The main limitation of these models is that they assume the urban boundary layer is at steady state and not dominated **by** a geostrophic wind (i.e. calm conditions).

# **1.3 Research goals**

The general objective of this thesis is to integrate building energy and urban climate studies, building on fundamental knowledge in both domains. The specific goals are the following:

- **"** Account for building thermal effects in climatological predictions, including the effect of active and passive building systems.
- Develop physically-based bottom-up models to predict building energy consumption at neighborhood or urban scale, specifically accounting for the energy interactions between buildings and the urban environment.
- Understand the dominant mechanisms of interactions between the energy performance of buildings and the urban climate.
- " Identify building configurations whose energy performance is sensitive to the **UHI** effect.
- " Develop a methodology to predict the **UHI** effect, both at mesoscale and canopy-scale levels, **by** using standard meteorological databases measured at operational weather stations.

## **1.4 Methodology**

Mirzaei and Haghighat [2010] review the existing approaches to study the **UHI** effect. Microscale **CFD** models are capable of obtaining accurate information about the canopy-scale UHI distribution at a particular location [Santiago and Martilli, 2010]. However, due to their high computational cost, their scope must be spatially and temporary limited; thus, these models cannot be applied to annual energy calculations and to analyses at a larger scale than a *few* blocks. Furthermore, the accuracy of **CFD** simulations strongly depends on the supplied boundary conditions, for which detailed information in most cases is not available, and on the treatment of the turbulence closure and radiation. In summary, although **CFD** simulations can be very useful for specific studies, especially involving air velocity distribution, a very high computational cost is paid for a gain in accuracy that is not guaranteed.

Mesoscale models are considered the state-of-the-art in atmospheric weather prediction, used as operational tools [Lafore et al., **1998].** These models represent the urban canopy as an aerodynamic roughness for which correlations act as a bridge between the surface and the first atmospheric layer. The latest generation of mesoscale models is coupled with UCMs, improving the representation of the thermal effect of urban areas on the atmosphere. However, their application to urban climate predictions, for which the temporal scale of interest ranges between few days to one year or even a century, is affected **by** the same limitations as microscale **CFD** models.

This research is based on the energy balance approach, which is the one used in building energy and urban canopy models. This thesis shows that this methodology is capable of providing estimates of the **UHI** effect within an acceptable accuracy range, both at mesoscale and at canopy-scale, and of building energy consumption at urban scale. The advantages are its simplicity and low computational cost. Simple models make the underlying physics easy to understand, test and improve. Fast models allow for parametric studies of greater spatial and temporal scales. The main limitation of the energy balance approach is that the air velocity field is not specifically solved and its effect is represented **by** correlations. This is particularly important for the heat exchange between the urban canyon air and the atmosphere above it, which is calculated from a formulation based on exchange velocities [Bentham and Britter, **2003].**

The models developed in this thesis are evaluated **by** comparison with both more sophisticated models whose validations have been reported in the literature and field data from experiments. The models that have been used in the evaluation process are EnergyPlus [Crawley et al., 2001], the TEB model [Masson, 2000], and a combination of the two (the **CS** presented in chapter 2) [Bueno et al., **2011].** The thesis also uses mesoscale simulation results obtained **by** climatologists of the **CNRM-GAME** (France) with the model Meso-NH [Lafore et al., **1998].** Field data corresponds to the experiment BUBBLE, carried out in Basel, Switzerland, in 2002 [Rotach et al., **2005];** the experiment **CAPITOUL,** carried out in Toulouse, France, between 2004 and **2005** [Masson et al., **2008];** and an experiment carried out in Athens, Greece, in **2009** [Synnefa et al., 2010].

#### **1.5 Thesis structure and scope**

The core of the thesis is divided into two parts and five chapters, which correspond to the five publications that have come out of this research: three published and two in the process of being published [Bueno et al. **2011;** 2012; 2012a; **2012b;** 2012c]. The first part is devoted to UC-BEMs, which are used to represent building thermal effects on climatological predictions and have the potential to predict building energy consumption at urban scale. The second part is devoted to a novel urban climate prediction tool, the **UWG,** which predicts urban air temperatures, both at mesoscale and canopy-scale, from measurements at operational weather stations.

Chapter 2 presents the **CS** between EnergyPlus and TEB. The **CS** combines models that are wellaccepted and evaluated within their respective scientific communities, building engineering and urban climatology. This makes the **CS** a very useful tool to evaluate other UC-BEMs (chapters **3** and 4). The **CS** allows an analysis of the effect on climate of sophisticated building and building system configurations (those included in EnergyPlus), as well as an evaluation of their sensitivity to urban climate conditions. In this chapter, the **CS** is evaluated **by** using field data from Toulouse, France. The comparison includes electricity and natural gas energy consumption of buildings, building fagade temperatures, and urban canyon air temperatures. As application examples of the **CS,** the chapter analyzes the effect of different building and **HVAC** system configurations on building energy consumption, waste heat released from **HVAC** systems, and outdoor air temperatures for the case study of Toulouse. Three different energy efficiency strategies are considered: shading devices, economizers, and heat recovery.

Chapter **3** presents the building energy model (BEM) that has been integrated in the TEB scheme. The advantage of this model with respect to the **CS** presented in chapter 2 is that it can be coupled with mesoscale atmospheric simulations. The **CS** required a number of iterations between EnergyPlus and TEB, which makes it computationally unsuitable for atmospheric coupling. The development of BEM-TEB is framed in the Project Muscade **[CNRM-GAME,** 2010] in order to represent future scenarios of urban climate and building energy consumption in French cities. Compared to previous UC-BEMs [Kikegawa **et** al., **2003;** Salamanca et al., 2010], BEM-TEB accounts for the dependence of the system capacity and efficiency on indoor and outdoor air temperatures and solves the dehumidification of the air passing through the system. Furthermore, it includes specific models for passive systems, such as window shadowing devices and natural ventilation. BEM-TEB has satisfactorily passed different evaluation processes, including testing its modeling assumptions, verifying that the chosen equations are solved correctly, and comparing the model with field data from Toulouse, France, and Athens, Greece.

Chapter 4 presents another **UC-BEM** based on a space-state solution of the thermal network that represents the fundamental physical relations between buildings and the urban environment. The RC model is a complement to the more detailed models previously presented (chapters 2 and **3).** Its advantages are its simplicity and computational efficiency. The model allows for faster parametric analyses and makes it possible to easily evaluate modeling hypotheses. In this chapter, the RC model is evaluated against the **CS** for different building configurations and seasons. The model is then used in a series of parametric analyses to investigate the impact of the **UHI** effect on the energy consumption of buildings in configurations that are parameterized in terms of internal heat gains, construction, geometry, glazing ratio, and infiltration level. The RC model is also used to investigate the dominant mechanisms **by** which the indoor environment affects outdoor air temperatures. Parameters such as indoor air temperatures, exfiltration heat, and waste heat from **HVAC** systems are analyzed. The conclusions obtained **by** this study can be applied to a wide range of urban configurations.

Chapter *5* presents a methodology to calculate air temperatures above the urban canopy layer from meteorological data measured at an operational weather station. This provides the boundary conditions required **by** UCMs used off-line (without being coupled with a mesoscale model). The proposed scheme is composed of two modules: a Vertical Diffusion Model (VDM) to calculate vertical profiles of air temperature at the weather station and an Urban Boundary-Layer **(UBL)** model to calculate air temperatures above the urban canopy layer. The VDM-UBL scheme is proposed as an alternative to mesoscale atmospheric simulations and makes it possible to include the coupled effect between the urban canopy layer and the urban boundary layer in urban climate predictions. In this chapter, the VDM-UBL scheme is evaluated against mesoscale atmospheric simulations and field data from Basel, Switzerland, and Toulouse, France.

Chapter **6** is devoted to the **UWG** scheme. The **UWG** is composed of the VDM-UBL scheme presented in chapter *5,* a Rural Station Model that calculates sensible heat fluxes at the weather station, and

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a **UC-BEM** based on those presented in chapters **3** and 4. The computational cost of the **UWG** is intentionally kept at the same order of magnitude as annual building energy simulations, and it specifically accounts for the energy interactions between buildings and the urban climate. In this chapter, the **UWG** is also evaluated against field data from Basel, Switzerland, and Toulouse, France.

Finally, chapter **7** provides a summary of contributions, comments on the limitations of the models, and outlines the prospects for future work.

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# **Urban canopy and building energy models**

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# **Chapter 2**

# **The Coupled Scheme between EnergyPlus and the TEB scheme**

# **2.1 Overview**

This chapter presents a Coupled Scheme **(CS)** between a detailed building energy simulation model, EnergyPlus [Crawley et al., 2001], and an urban canopy model, the Town Energy Balance (TEB) [Masson, 2000]. The **CS** combines models that have already been extensively used and evaluated and are well-known and accepted within their respective scientific communities, building engineering and urban climatology. This makes the **CS** a very useful tool to evaluate new Urban Canopy and Building Energy Models (UC-BEMs), such as those presented in chapters **3** and 4. It also allows an analysis of the effect on climate of sophisticated building configurations (those included in EnergyPlus), as well as an evaluation of their sensitivity to urban climate conditions.

In this chapter, first, an overview of building energy modeling as related to urban climate studies is presented. Then, the **CS** is described. An evaluation of the model is carried out **by** using field data from the experiment **CAPITOUL** [Masson et al., **2008]** conducted in Toulouse, France. As examples of possible applications of the **CS,** the scheme is used to study the impact of different building and **HVAC** system configurations on the energy consumption of buildings, **HVAC** waste heat emissions, and outdoor air temperatures. Three different energy efficiency strategies are evaluated: shading devices, economizers, and heat recovery.

## **2.2 Urban climate and building energy modeling**

#### **2.2.1 The Town Energy Balance (TEB) model**

**The TEB** model [Masson, 2000] is **a** physically-based urban canopy model initially developed to represent urbanized surfaces in atmospheric numerical simulations. The TEB model has been evaluated with observations in various urban sites and weather conditions [Masson and Grimmond, 2002; Lemonsu et al., 2004; Offerle et al., **2005;** Pigeon et al., **2008].** This model considers a two-dimensional approximation of an urban canyon formed **by** three generic surfaces: a wall, a road, and a roof. It calculates the climate conditions, the drag force, and heat fluxes of a town or neighborhood formed **by** identical urban canyons, where all orientations are possible and all exist with the same probability.

The TEB model is based on the energy balance approach. The urban canyon air is represented as a well-mixed thermal zone that exchanges heat with the generic wall, the generic road, and the atmosphere above the urban canopy layer. The generic roof exchanges heat directly with the atmosphere. Further developments of the TEB scheme divide the urban canyon in multiple horizontal layers [Hamdi and Masson, **2008].**

Prior to the integration of the building energy model presented in chapter **3,** the TEB model implemented a simple representation of building energy processes **by** solving a transient heat conduction equation through a multi-layered wall and roof. The force-restore method was applied to calculate indoor conditions from the contributions of the different building surfaces. Further developments of the TEB model included a minimum threshold to calculate the heating loads of the building associated with transmission through building surfaces [Pigeon et al., **2008].** Other phenomena, such as transmission through windows, internal heat gains and infiltration, and the calculation of cooling loads, were not yet included.

#### 2.2.2 **Building parametrizations**

Building parametrizations are simplified building energy models that are integrated in urban canopy models. Their mission is to account for building effects such as the waste heat emissions from **AC** systems on the urban climate, and to be able to represent the impact of the urban climate on the building energy performance of urban areas. The first building parametrization is developed **by** Kikegawa et al. **[2003].** In addition to solving the diffusion equation for walls, this model takes into account the internal sources of heat, solar radiation transmitted through windows, and the energy loads due to ventilation. Applying sensible and latent energy balances, the model calculates the energy demand required to maintain certain indoor conditions.

Salamanca et al. [2010] developed another building parametrization, but this time coupled with a multi-layer urban canopy model [Martilli et al., 2002]. This building parametrization allows the definition of multiple-story buildings and incorporates a more detailed treatment of windows, including the calculation of the transmitted solar radiation as a function of the angle of incidence. **A** range of comfort conditions and a maximum capacity of the **HVAC** system can also be specified in this model.

The building energy models of Kikegawa and Salamanca are able to capture the main heat transfer processes that occur inside buildings [Salamanca et al., 2010]. They are also able to predict the energy demand of a basic building configuration and to estimate the energy consumption and waste heat emissions of an **HVAC** system [Ihara et al., **2008;** Salamanca and Martilli, 2010].

#### **2.2.3** 'EnergyPlus

One industry-standard building simulation model, EnergyPlus [Crawley et al., 2001], calculates the energy demand of a building **by** applying a heat balance method **[DOE,** 2010a], somewhat similar to that used in the above-mentioned building parametrizations. It also implements detailed models for external heat transfer calculations such as convection, solar radiation (including shadows and reflections), and longwave radiation exchange with the sky. EnergyPlus has been extensively evaluated according to building simulation standards **[DOE,** 2010b,c].

One difference with respect to building parametrizations is that EnergyPlus can calculate the energy consumption of a specific **HVAC** system **by** solving the sensible and latent energy transformations of a working fluid (air or water) when this passes through the different **HVAC** components (coils, fans, heating and cooling plant equipment, economizers, cooling towers, etc.). Examples of specific **HVAC** systems are variable-air-volume, fan-coils, or chilled ceilings with dedicated outdoor air systems.

This detailed definition is intended to capture the real performance of **HVAC** systems that supply energy to cover the energy demand of the building and to counteract thermal losses through the system. The capacity of the system depends on the conditions inside and outside the building, and there are situations where the system is not able to supply the required energy, affecting the resulting indoor conditions. Cooling-system efficiency (as measured **by** the coefficient of performance **(COP),** the dimensionless ratio of thermal output to fuel input) also depends on the conditions inside and outside the building and on the part load ratio of the cooling plant. The latter takes into account the loss of efficiency when the cooling plant is not working at its maximum capacity.

In an ideal building energy model, the indoor air humidity is assumed constant and the latent energy supplied or removed **by** the **HVAC** system is directly equal to the latent energy demand of the building. On the contrary, a detailed definition solves for the dehumidification of the air passing through a cooling system. In many **HVAC** system configurations, the indoor air humidity is not controlled in the same way as the air temperature, so the calculation of the air humidity requires a psychrometric model of the air crossing the system. This capability allows a better estimation of building energy consumption and associated waste heat emissions.

Another difference between detailed building simulation models and building parametrizations is the capability of modeling building demand reduction strategies or passive systems. Passive systems take advantage of the sun, the wind and environmental conditions to reduce or eliminate the need for **HVAC** systems. Accurate simulation of their effect is sometimes crucial in predicting the overall energy performance of buildings and consequently the heat released from buildings into the environment. Examples of passive systems are shading devices, double-skin fagades, natural ventilation, heat storage devices, evaporative cooling, earth tubes for pre-heating or pre-cooling ventilation air, and cool or green roofs.

Finally, detailed building simulation models can make daylighting calculations and include them in the thermal energy balance of buildings. Lights can contribute significantly to building energy end-use, both directly and **by** adding heating loads, which affect the eventual waste heat released from **HVAC** systems.

## **2.3 Model description**

The **CS** combines EnergyPlus and the TEB model to calculate the energy performance of buildings and the urban climate around the buildings, taking into account the reciprocal interactions between the two. The latest version of the **CS** uses EnergyPlus *5.0* and the TEB model integrated in **SURFEX 6.1.**

#### **2.3.1 Definition of a reference building in EnergyPlus**

In the TEB model, the morphology of urban areas is represented **by** three parameters: the average building height *(hbld);* the horizontal building density *(Pbld),* defined as the building plan area divided **by** the plan area of the urban site; and the vertical-to-horizontal urban ratio *(VHurb),* defined as the exterior vertical building area divided **by** the plan area of the urban site. The model approximates any urban layout **by** a homogeneous and regular urban morphology through this parameterization. Although the TEB model has been evaluated in different and not necessarily regular urban areas, the effect of heterogeneities in this approximation has not been formally tested yet.

The **CS** uses the same urban morphology parameterization as the TEB model, including the concept of an average-oriented urban canyon [Masson, 2000]. The reference building in EnergyPlus is specified from TEB urban morphology parameters **by** assuming a regular layout of square-plan buildings (Fig. **2.1).** The geometric relationship can be expressed as:

$$
\rho_{bld} = a^2/(a/2 + b/2)^2, \tag{2.1}
$$

$$
VH_{urb} = 4ah_{bld}/(a/2 + b/2)^2,
$$
\n(2.2)

where a is the side of the square-plan building and *b* is the side of the square formed **by** the projection of the surrounding buildings fagades on the ground (Fig. 2.2). The geometric unit of the urban grid used to derive Eqs. 2.1 and 2.2 is indicated with a broken-dash line in both Figs. 2.1 and 2.2.



**Figure 2.1 -** Plan view of an urban area composed of a homogeneous grid of square-plan buildings. The geometric unit of the grid is indicated with a broken-dash line.

The reference building is composed of a single zone with an internal thermal mass representing intermediate floor constructions. Windows are defined such that their vertical dimension matches the vertical dimension of building fagades, and their horizontal dimension is a fraction of the horizontal dimension of building fagades according to the glazing ratio. Surrounding buildings are represented **by** shadowing surfaces. The solar radiation received **by** the four vertical surfaces of the reference building approaches the solar radiation received **by** walls in the average-oriented canyon calculated **by** the TEB model. **A** closer agreement to the average-oriented canyon approach can be achieved **by** rotating the building 45<sup>o</sup> with respect to the north-south axis (Fig. 2.2).

#### **2.3.2 Exchanged information**

Both EnergyPlus and the TEB model are able to calculate exterior wall and roof surface temperatures. In the **CS,** these surface temperatures are calculated **by** TEB and then used in EnergyPlus as boundary conditions. One of the reasons for this choice is that EnergyPlus simplifies the calculation of longwave radiation between a building surface and the surrounding urban surfaces, assuming that the latter are at the outdoor air temperature. Wall convective heat transfer correlations **(CHTC)** also differ between the



Figure 2.2 - Plan view of the reference building defined in EnergyPlus, indicating building walls, building windows and surrounding buildings. The building is rotated 45° with respect to the north-south axis. The geometric unit of the grid is indicated with a broken-dash line. The dimension parameters a and **b** are calculated from TEB's morphology parameters.

two models. Palyvos **[2008]** presented a literature review of **CHTC** applied to building surfaces, and proposed a generic correlation more similar to the one used in TEB [Masson, 2000] than to that used in EnergyPlus **[DOE,** 2010a].

The original version of the TEB model is only able to calculate surface temperatures associated with the fraction of fagades covered **by** walls, neglecting the effect of windows in the outdoor energy balance. Window surface temperatures can be significantly different from wall surface temperatures and are more affected **by** the indoor environment. The **CS** uses an adapted version of TEB that is able to use the window temperatures calculated **by** EnergyPlus in its outdoor energy balance according to the glazing ratio of building fagades. Solar reflections, convective and radiative heat exchanges are modified in TEB accordingly.

EnergyPlus also calculates the waste heat released from **HVAC** systems. In vapor-compression refrigeration cycles (the most common cooling systems), waste heat emissions  $(Q_{waste})$  can be calculated **by** adding the heat exchanged between the **HVAC** system and the building *(Qexh)* and the energy consumption of the HVAC system  $(Q_{HVAC})$ ,  $Q_{waste} = Q_{HVAC} + Q_{exch}$ . In fuel-combustion heating systems, waste heat emissions correspond to the combustion gases exhausted from chimneys and are calculated as  $Q_{waste} = Q_{HVAC} - Q_{exch}$ . The energy exchanged between the HVAC system and the building and the energy consumed **by** the system are calculated **by** EnergyPlus taking into account the interactions among system, building, and environment.

In reality, outdoor **HVAC** equipment can be located on the fagade or the roof of buildings. If located on the roof, waste heat emissions can have no effect on urban canyon air temperatures or an indirect effect through air recirculation from the roof to the urban canyon. This version of the **CS** assumes that all waste heat is released from building fagades, which represents a typical situation in which window or small split **AC** units are used. The calculated waste heat emissions are included in the outdoor energy balance of TEB as a wall-distributed energy source.

Future developments of the **CS** should also include the heat flux associated with the exfiltrated and exhausted air. Chapter 4 shows that the exfiltration heat flux can have a noticeable effect on urban air temperatures in winter. This effect is not accounted for in this chapter.

#### **2.3.3 Iterative coupling method**

The **CS** uses an iterative method to calculate the interactions between EnergyPlus and the TEB model. The iterative coupling process starts from a preliminary TEB simulation using off-line meteorological forcing information [Masson and Grimmond, 2002]. The wall temperatures, roof temperatures, and urban canyon climate conditions calculated **by** TEB are supplied as boundary conditions to an EnergyPlus simulation. Then, window temperatures and **HVAC** waste heat emissions calculated **by** EnergyPlus are used in a new iteration of TEB. This process (Fig. **2.3)** is repeated until a convergence criterion is satisfied. In the present study, convergence was assumed to be reached when the average canyon temperature difference between iterations fell below **0.05 'C.** This was typically achieved after two or three iterations.



Figure **2.3 -** Iterative method of the *CS.* The building energy model (EnergyPlus) calculates window temperatures and waste heat release from **HVAC** systems. The urban canopy model (TEB) calculates wall and roof surface temperatures, as well as climate conditions inside the urban canyon. Both models iterate until a convergence criterion is satisfied.

# **2.4 Model evaluation**

The **CS** is intentionally composed of well-established models and therefore relies on their respective previous evaluations. Additionally, this section uses field data from the experiment **CAPITOUL,** carried out in Toulouse, France, from February 2004 to March **2005** [Masson et al., **2008],** to verify that the iterative procedure of the **CS** is correctly implemented and to carry out a first evaluation of the model.

## **2.4.1 Observations from the CAPITOUL experiment**

Weather information at the top of urban canyons is used as boundary conditions in urban canopy models, such as the TEB model. During the **CAPITOUL** experiment, meteorological measurements were taken from an instrumented tower in the dense urban center of Toulouse at **27.5** m above the average building height and 47.5 m above the ground. In the same area, urban air temperatures were measured inside urban canyons. Instruments were placed in locations where air temperature could be representative of a larger scale than the street around them [Oke, 2004].

Surface temperatures of building fagades were measured with infrared radiometers for different urban canyon orientations. The results are the area-weighted fagade temperature resulting from the surface temperatures of the wall and the windows included in the view angle of the sensor. In addition, traffic heat release over a 500-m radius circle area around the instrumented tower was estimated **by** using automatic counters [Pigeon et al., **2008].** Anthropogenic heat from traffic is an input of the TEB model and the **CS.**

**A** city-scale inventory of electricity and natural gas energy consumption of buildings was also conducted during the experiment [Pigeon et al., **2007].** This is used to evaluate the capacity of the **CS** to predict heating energy consumption in winter. As it is explained below, electricity consumption data in summer suggests that **AC** systems are not widely used in Toulouse, so this case study is not suitable to compare cooling energy consumption. On the other hand, summer electricity consumption data is used to estimate building internal heat gains, which are an input of the model.

In climatology, anthropogenic heat flux refers to the energy input of an urban area that can be computed to human activity. It is therefore composed of traffic heat and building internal heat gains, which are inputs of the model, and energy consumption of **HVAC** systems, which is dynamically calculated **by** the model. This is different from the waste heat flux released **by** outdoor **HVAC** equipment, which includes internal heat gains and **HVAC** energy consumption, but also heat gains through the building enclosure. During the **CAPITOUL** experiment, anthropogenic heat flux data was obtained from the residual of the surface energy balance **(SEB)** equation [Pigeon et al., **2007]** and is compared with the **CS** simulations.

#### **2.4.2 Characterization of the dense urban center of Toulouse**

Table 2.1 presents the set-up of the original TEB model and the **CS** according to the reported information from the experiment. The thermal properties of construction materials used in this study are specified in Table 2.2. **A** number of modeling assumptions were made given the lack of detailed information about the buildings of the site. In the comparison between TEB simulations and CAPITOUL observations carried out **by** Pigeon et al. **[2008],** walls and roof were assumed to have no insulation. However, preliminary comparisons between simulation results and observations showed that both TEB and EnergyPlus consistently overpredict exterior wall temperatures in winter when no insulation is considered in the walls and roof. Furthermore, it is reasonable to think that many of the buildings in Toulouse are provided with some kind of insulation to reduce heating energy consumption in winter. This can be a simple aircavity or an insulation material installed after a rehabilitation process. Based on a comparison between calculated and observed wall surface temperatures in winter (section 2.4.3), an interior insulation layer 0.3-m thick was assumed in this study.

Figure 2.4 represents the daily-average observations of electricity consumption of buildings and outdoor air temperatures during two months in summer. As can be seen, variations of air temperature do not have a noticeable impact on electricity consumption, which presents a typical-week profile. This fact suggests that **AC** systems are not extensively used in Toulouse during the summer and that the electricity consumption of buildings is dominated **by** the use of domestic electricity devices. This conclusion is used to obtain an average internal heat gain value of 5.8 W  $m^{-2}$  (building floor area) to be used in the model. This value typically corresponds to the residential sector, which represents the majority of the buildings of the urban area under study.



Figure 2.4 **-** Daily-average observations of electricity consumption per unit of urban area (thick points) and urban canyon air temperature (thin points) between **19** June 2004 and **17** August 2004. The urban area corresponds to the dense urban center of Toulouse.

Infiltration level in buildings is an important source of modeling uncertainty, above all in the residential sector. Our analysis uses a generic infiltration/ventilation air flowrate value of *0.5* **ACH** (room air volume changes per hour). Finally, it is also assumed that **60%** of heating systems are fueled **by** natural gas and 40% are electric. This assumption is revisited in section 2.4.4.



**Table 2.1 -** Simulation parameters used for the evaluation of the **CS** with field data from the experiment **CAPI-TOUL** conducted in Toulouse (France). The terms urb and *fl* indicate unit of urban area and floor area, respectively.

**Table 2.2 -** Thermal properties of construction materials used in the simulations.



### **2.4.3 Model verification**

This section presents a comparison between the fagade temperatures and urban canyon air temperatures calculated **by** the **CS** and **by** the TEB model and those observed during the **CAPITOUL** experiment. The objective is to explain the effect of windows in the outdoor energy balance and to show that the iterative procedure of the **CS** is well implemented. Due to the lack of **AC** systems in this case study, outdoor air temperatures are expected to be very similar between the **CS** and the TEB model. **A** more detailed analysis of urban air temperatures is presented in chapter **6.**

#### Façade temperatures

Figure *2.5* presents a comparison between the measured fagade surface temperatures, the wall temperatures calculated **by** the original TEB, and the window and fagade temperatures calculated **by** the **CS** for winter and for summer.

Exterior window surface temperatures have a very different behavior with respect to exterior wall surface temperatures between winter and summer. Apart from thermal inertia and solar considerations, window surface temperatures are more affected **by** the indoor environment than exterior wall surface temperatures, because windows are less insulated. In winter, indoor air temperatures are significantly higher than outdoor air temperatures; thus, window surface temperatures are in general higher than exterior wall surface temperatures (Fig. **2.5** left). In summer, the difference between indoor and outdoor air temperatures is lower than in winter, and wall and window surface temperatures are similar. In Fig. *2.5* (right), window temperatures are slightly higher than wall temperatures during the night, which is related to the fact that the indoor air is not conditioned (no cooling system).

For this particular case study, the faeade temperatures calculated **by** the **CS** are similar to those predicted **by** the TEB model, although the latter excludes windows. In both cases, the error compared to observations is small (about 1 K), which justifies the assumptions relative to wall construction made in this comparison.



**Figure** *2.5* **-** Monthly-average diurnal cycle of fagade temperature from observations, calculated **by** TEB, and calculated **by** the **CS** for winter, January **16, 2005 -** February **15, 2005** *(left);* and for summer, July **16,** 2004 **-** August *15,* 2004 (right). The urban area corresponds to the dense urban center of Toulouse.

#### **Outdoor air temperatures**

Figure **2.6** compares the measured urban canyon air temperatures with the air temperatures calculated **by** TEB and **by** the **CS** for winter and for summer. Both models predict very similar outdoor air temperatures. In winter, waste heat emissions due to indoor air heating are small, and the difference in outdoor air temperatures are given **by** the higher window surface temperatures calculated **by** the **CS.** In summer, windows and walls have similar surface temperatures, and there are no waste heat emissions associated with cooling systems. This comparison shows a reasonably good agreement between the simulation results and observations with errors smaller than 1 K.



**Figure 2.6 -** Monthly-average diurnal cycle of urban canyon air temperature from observations, calculated **by** TEB, and calculated **by** the **CS** for winter, January **16, 2005 -** February **15, 2005** (left); and for summer, July **16,** 2004 **-** August **15,** 2004 (right). The urban area corresponds to the dense urban center of Toulouse.

#### **2.4.4 Comparison with field data from Toulouse, France**

#### **Heating energy consumption**

In this section, the capacity of the **CS** to predict heating energy consumption is tested **by** using electricity and natural gas consumption data obtained during the experiment.

Figure **2.7** shows the daily-average electricity and natural gas consumption for two months in winter. Observations are compared with the simulation results of the TEB model and the **CS.** The original TEB, which does not account for heat losses due to windows and infiltration, underestimates the heating energy consumption of buildings. Electricity and natural gas consumption computed as root-mean-square error (RMSE) and mean-bias error (MBE) between the **CS** and observations are presented in Table **2.3.** Given the modeling hypothesis indicated in section 2.4.2, the **CS** is able to capture the variations of electricity and gas consumption during the winter with RMSE and MBE lower than  $7 \text{ W m}^{-2}$  per unit of urban area, where the average electricity and gas consumption for the same period is  $30.8 \text{ W m}^{-2}$  and  $19.0 \text{ W}$  $m^{-2}$ , respectively. The underestimation in gas consumption can be related to uses of gas other than for indoor air heating, such as cooking and domestic hot water. Independent of the estimate of the fraction of houses with gas heat, the prediction of the sum of electricity and gas consumption agrees relatively well with observations.

**Table 2.3 -** Root-mean-square error (RMSE) and mean-bias error (MBE) between the daily-average electricity and gas consumption per unit of urban area calculated **by** the **CS** and observed from December **19,** 2004, to February **17, 2005.** The reference value (REF) is the average energy consumption for the considered time period.





Figure 2.7 – Daily-average electricity (left) and natural gas (right) consumption per unit of urban area from observations, calculated **by** TEB, and calculated **by** the **CS** between December **19,** 2004, and February **17, 2005.** The urban area corresponds to the dense urban center of Toulouse.

#### **Anthropogenic heat fluxes**

An additional comparison is carried out **by** using the anthropogenic heat *flux* data obtained during the experiment. Daily-average values of anthropogenic heat fluxes are represented for two months in winter and two months in summer (Fig. **2.8).** Observations are available for a certain number of days [Pigeon et al., **2007].** In winter, the original TEB accounts for anthropogenic heat fluxes due to traffic and building heating, without including other building energy uses. As a result, overall anthropogenic heat fluxes are underpredicted. In summer, assuming that a negligible number of cooling systems operate in the urban area, anthropogenic heat fluxes are dominated **by** the internal heat gains calculated in section 2.4.2. The relatively good agreement reinforces the validity of the assumptions made in this evaluation of the **CS.**



Figure **2.8 -** Daily-average anthropogenic heat per unit of urban area from observations, calculated **by** TEB, and calculated **by** the **CS** between December **19,** 2004, and February **17, 2005** (left); and from observations and calculated **by** the **CS** between June **19,** 2004, and August **17,** 2004 (right). In summer, the predicted anthropogenic heat fluxes are entirely based on the inputs of the model justified in section 2.4.2. The urban area corresponds to the dense urban center of Toulouse.

# **2.5 Application**

In section 2.4.2, observations indicated that **AC** systems are not used in the urban center of Toulouse, so waste heat emissions do not contribute significantly to urban heating. This situation is expected to change in the following years as a consequence of global-scale and urban-scale climate warming [Adnot, **2003].**

This section presents examples of the kind of analyses that can be carried out with the **CS.** In particular, the **CS** is used to analyze different scenarios of buildings and **HVAC** systems in Toulouse, including the presence of cooling systems and the waste heat emissions associated with them. Table 2.4 summarizes the new modeling parameters used in this analysis (other parameters are defined in Table **2.1).**



**Table 2.4 - CS** simulation set-up used in the application examples. Other parameters are defined in Table **2.1.**

# **2.5.1** Differences between an ideal and a realistic simulation of an **HVAC** system

The contribution of a detailed definition of **HVAC** systems with respect to an ideal representation was highlighted in section **2.2.3.** Here, the detailed definition will be referred to as a real **HVAC** simulation, in contrast to an ideal **HVAC** simulation. Fig. **2.9** shows the difference in **HVAC** waste heat emissions between a real and an ideal **HVAC** simulation for summer, which ranges between **7%** and **13%.** Two different building uses are represented: residential and commercial (Table 2.4). Different levels of waste heat emissions are predicted for the residential and the commercial buildings, around  $60 \text{ W m}^{-2}$  and  $190 \text{ W m}^{-2}$ W m<sup>-2</sup>, respectively, averaged on the urban area. A similar study carried out by Salamanca and Martilli [2010] predicted waste heat emissions in Basel (Switzerland) at summertime that ranged between **90** W  $m^{-2}$  and 160 W m<sup>-2</sup>.

The differences between the real and the ideal **HVAC** simulations are mainly related to the dehumidification of the air passing through the system, when this is cooled to meet the sensible energy demand of the building. The waste heat flux associated to the latent heat exchanged between the **HVAC** system and the building is accounted for in the real simulation but not in the ideal one.



**Figure 2.9 -** Monthly-average diurnal cycle of **HVAC** waste heat emissions per unit of fagade area from a real and an ideal **HVAC** simulation of a residential (left) and a commercial building (right) for summer, July **16,** 2004 **-** August 15, 2004. In this case study, units of façade area and urban area are equivalent because  $VH_{urb} \sim 1$ . The urban area corresponds to the dense urban center of Toulouse.

The fact that the evolution of waste heat during the day is less dynamic in the real case than in the ideal case can be explained **by** the limited capacity of the real **HVAC** system. During the peak hours of the warmest days, the system may not be able to provide the required energy and its energy consumption decreases with respect to the ideal simulation.

**A** statistical analysis of this comparison for the whole cooling period (cooling energy consumption is positive) indicates that the average waste heat difference between the real and the ideal **HVAC** simulation ranges between 2.4 and 9.1 W m<sup>-2</sup> of urban area, with maximum differences of 23.4 W m<sup>-2</sup> and 46.9 W  $m^{-2}$  for the residential and the commercial cases, respectively. This analysis corresponds to the simplest representation of a realistic **HVAC** system. Other common **HVAC** system configurations have associated energy losses (e.g. reheat systems) that would lead to greater differences between the real and the ideal simulation.
#### **2.5.2 Effect of waste heat on outdoor air temperatures**

Figure **2.10** compares the calculated outdoor air temperatures for summer with and without waste heat from **HVAC** systems. For the residential case, which is associated with low energy consumption and waste heat emissions, the average increase in outdoor air temperature is **0.8** K. In the commercial case, the average increase in the outdoor air temperature is **2.8** K. Similar values of air temperature increase due to **HVAC** systems have been reported previously [Kikegawa et al., **2003;** Ohashi et al., **2007;** Hamilton et al., **2009]. A** comprehensive parametric analysis of the impact of waste heat emissions on outdoor air temperatures is presented in chapter 4.



Figure 2.10 **-** Monthly-average diurnal cycle of urban canyon air temperature from a **CS** simulation of a residential and a commercial building in summer, assuming waste heat emissions from **HVAC** systems are released into the urban environment. The urban area corresponds to the dense urban center of Toulouse.

#### **2.5.3 Effect of shading devices on energy consumption and HVAC waste heat emissions**

Shading devices are passive systems that reduce the transmitted solar radiation into the building. Ideally, these devices should block direct solar radiation in the cooling period (summer), but allow the transmission of diffuse solar radiation for daylight purposes. They should also allow solar heat transmission in the heating period (winter) provided that there are no glare issues. In this analysis, two different shading devices typically used for residential and for commercial buildings in Toulouse are considered (Table 2.4).

Table *2.5* presents the annual cooling energy savings and average waste heat reduction associated with the use of shading devices in summer for residential and commercial buildings. Residential buildings, whose cooling loads are more sensitive to the transmitted solar radiation due to the low internal heat gains, can achieve reductions in energy savings and waste heat emissions of 21% and **29%,** respectively, **by** using shading devices. Having a similar absolute value of waste heat reduction (similar impact on the outdoor environment), commercial buildings present lower relative values of energy consumption and waste heat reduction than residential buildings (around *5%).*

#### 2.5.4 **Effect of economizers on energy consumption and HVAC waste heat** emissions

An economizer allows more than the minimum outdoor airflow to enter the building when the outdoor temperature is favorable (cooler than indoors in summer). This reduces the consumption of the cooling

**Table** *2.5* **-** Annual energy savings and average waste heat reduction associated with the use of shading devices, economizers, and heat recovery systems. Energy savings and waste heat reductions are referred to the cooling system for shading devices and economizers and to the heating system for the heat recovery.



plant and its waste heat emissions but penalizes the electricity consumption of fans. The application of economizers can be useful in commercial buildings when outdoor air temperatures are below the cooling set point and buildings still have cooling energy demand due to internal heat gains. In residential buildings, the same effect is usually achieved **by** means of natural ventilation (opening the windows), which does not require the electricity consumption of a fan. The effectiveness of these strategies is very sensitive to increases in outdoor air temperatures, which reduce the amount of time they can operate. For the purposes of this analysis, an economizer is also applied to the residential case instead of a natural ventilation system. The main difference is the outdoor airflow passing through the building, which is constant for an economizer and variable for a natural ventilation system. The results of this analysis provide an upper limit for natural ventilation potential.

Table 2.4 presents the modeling parameters of the economizer considered in this study. Energy savings and waste heat reduction are achieved when outdoor air temperatures are within the minimum and the maximum temperature thresholds of the economizer. This occurs during the warmest days in late spring and fall and during the coolest days in early summer and fall. For the warmest days in summer (from mid-July), the economizer cannot operate and there are no associated reductions in waste heat.

Table **2.5** presents the annual cooling energy savings and average waste heat reduction associated with the use of economizers for residential and commercial buildings in Toulouse. Residential buildings can achieve reductions in energy consumption and waste heat emissions of **7%** and **15%,** respectively. Commercial buildings can save around **3%** in both energy consumption and waste heat emissions **by** using economizers. In both cases, the effect of waste heat reduction on the outdoor environment is negligible.

#### **2.5.5 Effect of heat recovery on energy consumption and HVAC waste heat emissions**

**A** heat exchanger located between the exhaust air coming from the building and the ventilation air coming from outdoors reduces ventilation heat losses, which are an important fraction of the heating energy demand of buildings in winter. Although not included in this analysis, heat recovery systems also reduce the exfiltration heat flux, which can have an effect on outdoor air temperatures in winter (see chapter 4). In summer, the temperature difference between indoor and outdoor conditions is lower than in winter and heat recovery systems are less effective. Due to the close interaction with the outdoor environment, heat recovery systems are also sensitive to the **UHI** effect.

Table 2.4 presents the parameters of the heat recovery system considered in this analysis. Table *2.5*

presents the annual heating energy savings and average **HVAC** waste heat reduction associated with the use of heat recovery systems for residential buildings in Toulouse. Reductions in energy consumption and waste heat emissions of *50%* and **60%,** respectively, can be achieved **by** this strategy. However, due to the low waste heat emissions associated with fuel-combustion heating systems, the effect of heat recovery systems on the outdoor environment is negligible. This analysis does not include commercial buildings because their heating energy consumption is very small in this case.

 $\mathcal{L}(\mathcal{L}^{\mathcal{L}})$  and  $\mathcal{L}(\mathcal{L}^{\mathcal{L}})$  and  $\mathcal{L}(\mathcal{L}^{\mathcal{L}})$  $\sim 10^{-10}$ 

## **Chapter 3**

# **The building energy model integrated in the TEB scheme**

#### **3.1 Overview**

This chapter presents a Building Energy Model (BEM) integrated in the Town Energy Balance (TEB) scheme [Masson, 2000]. BEM-TEB is therefore an improvement of TEB, which allows a better representation of the effect of buildings on the urban climate. The advantage of this model with respect to the Coupled Scheme **(CS)** presented in chapter 2 is that it can be coupled with mesoscale atmospheric simulations. The **CS** required a number of iterations between EnergyPlus and TEB, which makes it computationally unsuitable for atmospheric coupling.

The development of BEM-TEB is framed in the Project Muscade **[CNRM-GAME,** 2010] in order to represent future scenarios of urban climate and building energy consumption in French cities. BEM-TEB proposes a physically-based (bottom-up) approach to estimate building energy consumption at city scale  $(\sim 10 \text{ km})$  with a resolution of a neighborhood  $(\sim 100 \text{ m})$ . Modeling building energy consumption at urban scale has the advantage of building aggregation but requires taking into account the energy interactions between buildings and the urban environment. Building aggregation allows the simplification of the building thermal definition. The underlying assumption is that the average building of a certain urban area is more homogeneous and generic than each particular building. Compared to previous urban canopy and building energy models [Kikegawa et al., **2003;** Salamanca et al., 2010], BEM-TEB includes specific models for active and passive building systems. As described in section **2.2.3,** the possibility to model specific active and passive building systems allows a better estimation of building energy consumption and associated waste heat emissions.

The chapter is divided in two main sections. In the first one, the underlying physics of the model are presented in detail. In the second section, the model is evaluated at three levels: modeling assumptions; model verification, based on a comparison with the **CS;** and model validation, based on a comparison with field data from the experiment **CAPITOUL** [Masson et al., **2008]** (Toulouse, France) and an experiment carried out in Athens, Greece [Synnefa et al., **2010].**

#### **3.2 Model description**

#### **3.2.1 Objective and main features**

BEM-TEM constitutes a new version of the urban canopy model TEB, in which the energy effects of buildings on the urban climate are better represented. The new version of the model makes it possible to calculate building energy consumption at city or neighborhood scale. Previous versions of the TEB model (without being coupled with EnergyPlus) could not calculate cooling energy consumption and waste heat emissions associated with **HVAC** systems.

BEM calculates the energy demand of a building **by** applying a heat balance method. It considers a single thermal zone and represents the thermal inertia of intermediate building levels **by** a generic thermal mass. The model accounts for solar radiation through windows, heat conduction through the enclosure, internal heat gains, infiltration, and ventilation (Fig. **3.1).**



Figure **3.1 -** Diagram of a building and an urban canyon. The main physical processes included in BEM-TEB are represented: heat storage and conduction of construction materials, waste heat from **HVAC** systems, solar radiation through windows, internal heat gains, infiltration, and ventilation. The diagram also represents the multilayer version of the TEB scheme [Hamdi and Masson, **2008]** and the possibility of coupling it with a mesoscale atmospheric model. *Diagram elaborated by G. Pigeon.*

BEM includes specific models for active and passive building systems. It considers the dependence of the cooling system efficiency on indoor and outdoor temperatures and solves the dehumidification of the air passing through the system. The model implements simple representations of window shades and natural ventilation.

The model has been kept as simple as possible, while maintaining the required features of a compre-

hensive building energy model. Multizone building calculations have been intentionally avoided, as part of an overall goal to sacrifice computational efficiency only for a significant gain in accuracy.

#### **3.2.2 Geometry and building definition**

BEM uses the same geometric principles as the TEB model and the **CS,** described in section **2.3.1.** These geometric principles imply that the building enclosure is defined as an average-oriented fagade and a flat roof, and that the glazing-to-fagade ratio is assumed uniform for all the urban area under study. In addition, the following is assumed to define buildings in BEM:

- **"** Single thermal zone: BEM assumes that all buildings in a particular urban area have the same indoor air temperature and humidity. This approach is justified if the objective is to calculate the overall energy consumption of a building (or neighborhood), rather than the energy performance of a specific building zone.
- Internal thermal mass: In the single-zone approach, an internal thermal mass represents the thermal inertia of the construction materials inside a building (e.g. separation between building levels). The transmitted solar radiation and the radiant fraction of internal heat gains are perfectly absorbed **by** the internal thermal mass and then released into the indoor environment.

#### **3.2.3 Heat balance method**

BEM uses a heat balance method to calculate indoor thermal conditions and building energy demand. An energy balance is applied to each indoor surface (is: wall, window, floor, roof, and internal mass), accounting for conduction, convection, and radiation heat components, viz.

$$
Q_{cd} + Q_{cv} + \sum_{is} Q_{rd} = 0.
$$
 (3.1)

The convection and radiation terms are calculated from a standard heat transfer coefficient formulation,  $Q = h\Delta T$  (see appendix B). Convective heat transfer coefficients depend on the relative position between the surface and the indoor air. Radiative heat transfer coefficients are obtained from linearization of the Stefan-Boltzmann equation, assuming only one bounce of radiative heat fluxes between surfaces. The transient heat conduction through massive building elements (walls, floor, roof, and internal mass) is calculated using TEB routines, which are based on the finite difference method.

To calculate the dynamic evolution of indoor air temperature between a cooling and a heating thermal set point, BEM solves a sensible heat balance at the indoor air. The sensible heat balance is composed of the convective heat fluxes from indoor surfaces, the convective fraction of internal heat gains, the infiltration sensible heat flux, and the sensible heat flux supplied **by** the **HVAC** system.

$$
V_{\text{bld}} \rho c_v \frac{dT_{\text{in}}}{dt} = \sum_{\text{is}} A_{\text{is}} h_{\text{cv},\text{is}} (T_{\text{is}} - T_{\text{in}})
$$
  
+ $Q_{\text{ig}} (1 - f_{\text{rd}}) (1 - f_{\text{lat}})$   
+ $V_{\text{inf}} \rho c_p (T_{\text{urb}} - T_{\text{in}})$   
+ $m_{\text{sys}} c_p (T_{\text{sys}} - T_{\text{in}})$ , (3.2)

where  $T_{in}$  is the indoor air temperature;  $V_{\text{bld}}$ ,  $\rho$ ,  $c_v$ , and  $c_p$  are the volume, density, and specific heat at constant volume and pressure of the indoor air, respectively; *Ais* is the area of the indoor surface; **Qig** represents the internal heat gains;  $f_{\text{lat}}$  is the latent fraction of internal heat gains;  $f_{\text{rd}}$  is the radiant fraction of sensible internal heat gains;  $\dot{V}_{\text{inf}}$  is the infiltration air flowrate;  $T_{\text{urb}}$  is the outdoor air temperature; and  $m_{\text{sys}}$  and  $T_{\text{sys}}$  are the mass flowrate and temperature of the air supplied by the HVAC system.

**A** latent heat balance is also solved to calculate the dynamic evolution of indoor air humidity. The latent heat balance is composed of the latent fraction of internal heat gains, the infiltration latent heat flux, and the latent heat flux supplied **by** the **HVAC** system.

$$
V_{\rm bd}\rho l_{\rm v}\frac{dq_{\rm in}}{dt} = Q_{\rm ig}f_{\rm lat} + \dot{V}_{\rm inf}\rho l_{\rm v}(q_{\rm orb} - q_{\rm in}) + \dot{m}_{\rm sys}l_{\rm v}(q_{\rm sys} - q_{\rm in}),\tag{3.3}
$$

where  $l_v$  is the water condensation heat, and  $q_{in}$ ,  $q_{urb}$ , and  $q_{sys}$  are the specific humidity of the indoor air, of the outdoor air, and of the air supplied **by** the **HVAC** system, respectively.

The building energy demand is calculated **by** applying the same sensible and latent heat balances at the indoor air, but assuming that this is at set point conditions. The specific humidity set point used for latent energy demand calculations is obtained from the relative humidity set point and the cooling or the heating temperature set point, which are provided **by** the user.

$$
Q_{\text{dem,sens}} = \sum_{\text{is}} Q_{\text{cv},\text{is}} + Q_{\text{ig,sens}} + Q_{\text{inf}/\text{vent,sens}},\tag{3.4}
$$

$$
Q_{\text{dem,lat}} = Q_{\text{ig,lat}} + Q_{\text{inf/vent,lat}}.\tag{3.5}
$$

#### **3.2.4 Windows and solar heat transmission**

Window effects have been introduced in the outdoor energy balance of the **TEB model. The external** surfaces of windows participate in the outdoor energy balance in the same manner as other urban surfaces (walls, road, garden, etc.). Window surfaces are semi-transparent and therefore have three optical properties (albedo, absorptivity, and transmittance). Two coupled surface energy balances are solved to calculate the internal and external surface temperatures of windows. Each surface energy balance accounts for the convective and radiative heat fluxes reaching the surface and the steady-state heat conduction through the window.

Building energy models usually consider the dependence of the solar heat transmitted through windows on the angle of incidence of the sun. However, simulations with EnergyPlus for different window orientations show that for an average-oriented canyon, the solar transmittance of windows  $(\tau_{win})$  can be approximated **by** a uniform value of *0.75* times the solar heat gain coefficient **(SHGC)** (see appendix B). The **SHGC** can be found in window catalogues and represents the fraction of incoming solar radiation that participates in the indoor energy balance. The solar heat transmitted through windows  $(Q_{sol,vin})$  is then calculated as:

$$
Q_{sol,win} = Q_{sol,w} \tau_{win} GR,
$$
\n(3.6)

where  $Q_{sol,w}$  is the solar radiation reaching the building façade and GR is the glazing ratio.

The solar absorptivity of windows is calculated as a function of the U-factor and the **SHGC, by** using the equations proposed in EnergyPlus documentation **[DOE,** 2010a]. The U-factor can also be found in window catalogues and measures the window conductance, including the convective and longwave heat transfer coefficients at both sides of the window.

The window albedo is calculated so that the three optical properties (albedo, absorptivity, and transmittance) sum to unity. Then, the model uses an area-averaged fagade albedo to calculate solar reflections **by** weighting the albedo of walls and windows with the glazing ratio of buildings.

#### **3.2.5 Passive building systems**

Section **2.2.3** highlighted the importance of considering passive building systems in energy simulation both at building scale and at urban scale. Passive systems may affect drastically the building energy performance, reducing or eliminating the need of **HVAC** systems; and they are among the strategies to improve the sustainability of urban areas.

#### **Natural ventilation**

In residential buildings in summer (especially when an active cooling system is not available), occupants usually open their windows to naturally ventilate indoor spaces. To represent this situation, BEM includes a natural ventilation module, which modifies the indoor air energy balance (Eqs. **3.2** and **3.3) by** including an outdoor air flowrate term, similarly to the infiltration term. **If** the conditions are favorable for natural ventilation, the **HVAC** system is assumed to be turned off at least during one hour. The natural ventilation air flowrate is calculated from a correlation that depends on the outdoor air velocity, the indoor and outdoor air temperatures, and the geometry of buildings and windows (see appendix B).

#### **Window** shades

BEM also includes a simplified model to account for window shadowing devices. **If** the solar radiation reaching the window is above a predefined threshold, the model considers that shades are placed outside and in front of the windows. These shades are characterized **by** a predefined transmittance. The model reduces the solar radiation reaching the windows **by** changing its optical properties. The solar radiation that is not reflected, absorbed, or transmitted **by** the windows is assumed to be converted into a sensible heat flux toward the urban canyon.

#### **3.2.6 HVAC** system

#### **Ideal and realistic definitions of an HVAC system**

BEM includes both an ideal and a realistic definition of an **HVAC** system (see section **2.5.1).** In the ideal definition, the system capacity is infinite, and the system supplies the exact amount of energy required to maintain indoor thermal and humidity set points. On the contrary, the realistic definition considers a finite capacity that can be provided **by** the user or calculated **by** the *autosize* function.

In the case of a cooling system, the realistic definition also takes into account the dependence of the system capacity and efficiency on outdoor and indoor conditions. Furthermore, the system efficiency is affected **by** part-load performance, when the system does not work at its nominal capacity. The realistic definition of the cooling system solves for the dehumidification of the air passing through the cooling coil. In most **HVAC** system configurations, the indoor air humidity is not controlled in the same way as the air temperature, so the calculation of the air humidity requires a psychrometric model of the air crossing the system. Fig. **3.2** represents a psychrometric chart of humid air and the significant points of the **HVAC** model for a cooling situation (summer).

#### **Mixing conditions**

To calculate the supply air conditions and the energy consumption of the **HVAC** system, the model first calculates the mixing conditions of the air recirculated from the building and the outdoor air required for



**Figure 3.2 -** Psychrometric chart of humid air. The significant points of the **HVAC** system model for a cooling situation are represented. Zone conditions refer to the temperature and humidity of the indoor air. Recirculated air from the zone is mixed with outdoor air before entering the cooling coil (mixing conditions). The air leaves the cooling coil at supply conditions. The apparatus dewpoint **(ADP)** is an input of the model and represents the temperature of the air leaving the cooling coil if this would be saturated.

ventilation. This calculation is the same for both the cooling and the heating system models. The mixing ratio ( $X_{\text{mix}}$ ) is calculated as  $X_{\text{mix}} = V_{\text{vent}} \rho / m_{\text{sys}}$ , where  $m_{\text{sys}}$  is the supply air mass flowrate and  $V_{\text{vent}}$  is the ventilation air volume flowrate, which are given **by** the user (or calculated **by** the *autosize* function in the case of the air mass flowrate) **.** Then, the mixing air temperature and humidity are calculated from the building air temperature and the outdoor air temperature as follows:

$$
T_{\text{mix}} = X_{\text{mix}} T_{\text{urb}} + (1 - X_{\text{mix}}) T_{\text{in}},
$$
\n(3.7)

and

$$
q_{\text{mix}} = X_{\text{mix}} q_{\text{urb}} + (1 - X_{\text{mix}}) q_{\text{in}}.
$$
\n(3.8)

#### **Cooling system**

In the ideal cooling system model, the energy consumption is calculated **by** adding the sensible and the latent energy demand of the building and dividing **by** the system coefficient of performance **(COP),**  $Q_{\text{HVAC,cool}} = Q_{\text{dem,cool}}$ /COP. The supply conditions are then calculated to meet the building energy demand:

$$
T_{\rm sys} = T_{\rm mix} - H_{\rm dem,cool} / \left( \dot{m}_{\rm sys} c_{\rm p} \right),\tag{3.9}
$$

and

$$
q_{\rm sys} = q_{\rm mix} - \text{LE}_{\rm dem,cool} / (m_{\rm sys} l_{\rm v}), \qquad (3.10)
$$

where  $H_{\text{dem.cool}}$  and  $LE_{\text{dem.cool}}$  are the sensible and latent cooling demand of the building.

In the realistic cooling system model, the model solves a pychrometric model based on the apparatus dewpoint **(ADP)** temperature. The current version of BEM considers a constant-volume direct-expansion cooling system without reheat, but other system configurations can be added in future versions of the model. At each time step, the supply air temperature and humidity are calculated **by** satisfying two conditions. First, the supply point in the psychrometric chart (Fig. **3.2)** must fall on the line connecting the mixing point and the **ADP** point. Second, the supply temperature should meet the sensible energy demand of the building **(Eq. 3.9). If** the energy demand of the building is greater than the system capacity, the system capacity is used to calculate the supply temperature.

The system capacity  $(Q_{\text{cap,sys}})$  is calculated from the nominal system capacity multiplied by a coefficient that depends on outdoor and indoor conditions (see appendix B). The electricity consumption of the cooling coil  $(Q_{HVAC,sys})$  is calculated by the following expression:

$$
Q_{\text{HVAC,sys}} = Q_{\text{cap,sys}} \text{PLR} f_{\text{PLR}} / \text{COP}, \tag{3.11}
$$

where PLR is the part-load ratio, calculated as the fraction between the energy supplied and the system capacity, and  $f_{PLR}$  is a coefficient that depends on the PLR and accounts for the loss of the system efficiency due to part-load performance. The actual **COP** of the system is calculated from the nominal **COP** (provided **by** the user) multiplied **by** a coefficient that depends on outdoor and indoor conditions (see appendix B).

#### Heating system

The current version of BEM considers a fuel-combustion heating system. Other heating systems, such as heat pumps, can be added in future versions of the model. The supply air temperature of the heating system is calculated to meet the sensible heating energy demand of the building **(Eq. 3.12). If** the energy demand of the building is greater than the system's heating capacity, the heating capacity is used to calculate the supply temperature.

$$
T_{\rm sys} = T_{\rm mix} + H_{\rm dem, heat} / \left( \dot{m}_{\rm sys} c_{\rm p} \right). \tag{3.12}
$$

The heating system model assumes that the indoor air humidity is not controlled and that the supply air humidity is the same as the mixing humidity **(Eq. 3.8).** The energy consumption of the heating system is calculated from the thermal energy exchanged between the heating system and the indoor air  $(Q_{\text{exch,heat}})$ divided by a constant efficiency( $\eta_{\text{heat}}$ ), provided by the user.

$$
Q_{\text{HVAC},\text{heat}} = Q_{\text{exch},\text{heat}} / \eta_{\text{heat}}.
$$
 (3.13)

#### Fan electricity consumption

The fan electricity consumption is calculated from the following correlation extracted from EnergyPlus documentation **[DOE,** 2010a]:

$$
P_{\text{fan}} = \dot{m}_{\text{sys}} \Delta P_{\text{fan}} \eta_{\text{fan}} / \rho, \tag{3.14}
$$

where  $\Delta P_{\text{fan}}$  is the fan design pressure increase, predefined as 600 Pa; and  $\eta_{\text{fan}}$  is the fan total efficiency, predefined as **0.7.** These predefined values are the same as the default values used in EnergyPlus.

#### Waste heat emissions

The waste heat released into the environment **by** a cooling system is given **by:**

$$
Q_{\text{waste,cool}} = Q_{\text{exch,cool}} + Q_{\text{HVAC,cool}},
$$
\n(3.15)

where  $Q_{\text{exch,cool}}$  is the thermal energy exchanged between the cooling system and the indoor air, and QHVAC,cool is the energy consumption of the cooling system (e.g. electricity). The user can specify the sensible-latent split of the waste heat produced **by** the cooling system, depending on whether the system is air-condensed, water-condensed, or both.

For the heating system, the waste heat flux is related to the energy contained in the combustion gases and is given **by:**

$$
Q_{\text{waste, heat}} = Q_{\text{HVAC,heat}} - Q_{\text{exch,heat}},
$$
\n(3.16)

where  $Q_{\text{HVAC,heat}}$  is the energy consumption of the heating system (e.g. gas).

The heat flux associated with the exfiltrated and exhausted air is added to the waste heat flux from **HVAC** systems, assuming that the air leaves the buildings at indoor air temperature.

#### **Autosize function**

For the realistic model of an **HVAC** system, BEM requires information about the size of the system. The parameters that determine the size of a system are the rated cooling capacity and the maximum heating capacity. For a constant-volume cooling system, the model also requires its design mass flowrate. This information can be provided to the model manually, or it can be automatically calculated **by** the *autosize* function.

*The autosize* function first calculates the maximum heating capacity **by** applying a sensible heat balance at the indoor air **(Eq.** 3.4), assuming steady-state heat conduction through the enclosure. An equivalent outdoor air temperature is calculated as the average between the design minimum air temperature (provided **by** the user) and a generic sky temperature **(253** K). The required air flowrate is then obtained from **Eq. 3.17,** assuming a supply air temperature of **323** K.

$$
\dot{m}_{\text{sys,rat}} = \frac{Q_{\text{heat,max}}}{c_{\text{p}} \left( T_{\text{supply}} - T_{\text{heat,target}} \right)}.
$$
\n(3.17)

To calculate the rated cooling capacity, the model dynamically simulates the building during four days, between July 12 and July *15.* The rated cooling capacity corresponds to the maximum cooling energy required to maintain indoor set point conditions for the last day of simulation. This dynamic simulation uses a predefined diurnal cycle of outdoor air temperature and incoming solar radiation (see appendix B). Incoming solar radiation depends on the specific location of the urban area, using the solar zenith angle calculated **by** the TEB model. Outdoor air humidity, air velocity, and air pressure are considered constant during this simulation.

Once the rated cooling capacity is calculated, the required air flowrate is obtained assuming a supply air temperature of **287** K. The rated air flowrate is the maximum of those calculated for cooling and for heating conditions.

### **3.3 Model evaluation**

#### **3.3.1 Modeling assumptions**

**A** methodology is proposed to evaluate BEM assumptions. Two models of the same building with different levels of detail are compared **by** simulating them with EnergyPlus. The first model, which is referred as the detailed model (DM), includes the exact geometry of the building enclosure, defines each building level as a separate thermal zone, and introduces internal heat gains in terms of people, lighting, and equipment. The second model, which is referred as the simplified model **(SM),** maintains the assumptions of BEM. It considers a square-base building defined as a single thermal zone with internal mass, somewhat similar to the reference building of the **CS** described in section **2.3.1.** The building height, vertical-to-horizontal building area ratio, roof-to-horizontal building area ratio, glazing ratio, construction configuration of the enclosure (materials and layers), total internal heat gains, and infiltration air flowrate are the same as the DM (Table **3.1).**

To avoid orientation-specific results, DM is simulated for eight different orientations, every **450,** and SM is simulated for two different orientations, rotated 45° between each other. Then, the averaged results from each set of simulations are compared.



**Table 3.1** – Simulation parameters used in the comparison between the simplified EnergyPlus model and the detailed EnergyPlus model of a residential Haussmannian building. The thermal properties of construction materials are summarized in Table 2.2. The term **fl** indicates unit of floor area.

The results presented in this section were obtained in collaboration with K. Zibouche from **CSTB** (Paris, France) and **G.** Pigeon from **CNRM-GAME** (Toulouse, France). The case study corresponds to a Haussmannian building in Paris (Fig. **3.3).** Fig. 3.4 and *3.5* represent the daily-average and monthlyaverage diurnal cycles, respectively, of heating energy demand in winter and cooling energy demand in summer calculated **by** the simplified and the detailed EnergyPlus models. Differences in heating and cooling energy demands, computed as root-mean-square error (RMSE) and mean-bias error (MBE) between the **SM** and the DM, are presented in Table **3.2.** The RMSE of heating energy demand is  $0.9 \text{ W m}^{-2}$  of floor area, where the average heating energy demand calculated by the DM for the same period is 19.5 W m<sup>-2</sup>. The RMSE of cooling energy demand is  $1.4 \text{ W m}^{-2}$ , where the average for the same period is 9.1 W m<sup>-2</sup>. In this case, the MBE is 0.9 W m<sup>-2</sup>, which indicates that the SM overestimates the cooling energy demand.







Figure **3.3 -** Image of a Haussmannian building in Paris (top). Representation of the detailed model defined in EnergyPlus (middle). Representation of the simplified model defined in EnergyPlus (bottom).



Figure 3.4 - Heating (left) and cooling (right) energy demand per unit of floor area for winter and summer calculated **by** the simplified and the detailed EnergyPlus models of a Haussmannian building in Paris.



Figure *3.5* **-** Monthly-average diurnal cycles of heating energy demand between January **16** and February *15, 2005* (left), and cooling energy demand between July **1** and July **30,** 2004 (right), per unit of floor area calculated **by** the simplified and the detailed EnergyPlus models of a Haussmannian building in Paris.

 $\hat{U}$ 

**Table 3.2 -** Root-mean-square error (RMSE), mean-bias error (MBE), and reference value (REF) of the variables compared in each of the three evaluation sections. The reference value of energy and heat fluxes is the average of the energy and heat fluxes for the considered time period. The terms urb and **fl** indicate unit of urban area and floor area, respectively.



#### **3.3.2 Model verification**

To check that the chosen equations are solved correctly, BEM-TEB is compared to the **CS** between EnergyPlus and TEB (chapter 2). The case study corresponds to the residential urban center of Toulouse, which was characterized in section 2.4.2. To be able to compare cooling energy consumption between the two models, this study assumes that **AC** systems are widely used in the urban area. The input parameters are summarized in Table **3.3.**

Figures **3.6** and **3.7** represent the daily-average and monthly-average diurnal cycles, respectively, of heating energy demand in winter and cooling energy demand in summer calculated **by** BEM and the **CS.** Scores for this comparison are presented in Table **3.2.** The RMSE of heating and cooling energy demand ranges between 0.8 and  $1.1 \text{ W m}^{-2}$  of floor area, where the average heating and cooling energy demand calculated by the CS is around  $6 W m^{-2}$  for the same period. As can be seen, BEM slightly overestimates cooling energy demand in summer (negative MBE) and underestimates heating energy demand in winter (positive MBE) compared to the **CS.** This can be explained **by** the fact that the solar radiation model of the TEB scheme tends to overestimate the solar radiation reaching building fagades as compared with the **CS.**

Figure **3.8** compares the daily-average cooling energy consumption and waste heat emissions of the **HVAC** system calculated **by** BEM and the **CS.** The RMSE of cooling energy consumption is **0.7** W m-2 of floor area (Table **3.2),** where the average cooling energy consumption calculated **by** the **CS** is **3** W m-2 for the same period. **A** relative error of 20 **%** in building energy consumption is acceptable given the stateof-the-art of urban canopy models. Grimmond et al. [2011] show that the surface heat flux error of urban canopy models is usually greater than 20 *%.* **A** similar order of magnitude difference is encountered for the waste heat emissions calculated **by** both models. The RMSE of waste heat emissions is **9.8** W m-2 of urban area, where the average waste heat fluxes for the same period is **50.2W** m-2.

**Table 3.3 -** Simulation parameters used in the evaluation of BEM-TEB for the case study of the residential urban center of Toulouse, France. In the comparison between BEM-TEB and the **CS,** the study assumes that **AC** systems are used in this urban area. In the comparison between BEM-TEB and observations, the study represents the actual situation in which **AC** systems are not widely used in the urban area. The thermal properties of construction materials are indicated in Table 2.2.





Figure 3.6 – Daily-average heating (left) and cooling (right) energy demand per unit of floor area for winter and summer calculated **by** the **CS** and **by** BEM-TEB for the dense urban center of Toulouse.



Figure **3.7 -** Monthly- diurnal cycles of heating energy demand between January 1 and January **30, 2005** (left), and cooling energy demand between July 1 and July **30,** 2004 (right), per unit of floor area calculated **by** the **CS** and **by** BEM-TEB for the dense urban center of Toulouse.



Figure **3.8 -** Daily-average cooling energy consumption per unit of floor area (left) and waste heat emissions per unit of urban area (right) calculated **by** the **CS** and **by** BEM-TEB for the dense urban center of Toulouse.

#### **3.3.3 Comparison with field data from Toulouse, France**

Field data from the **CAPITOUL** experiment is used to evaluate BEM-TEB in winter. The case study of Toulouse was used in the previous section and characterized in section *2.4.2.* The characterization of the site includes the justification of modeling assumptions, given the lack of detailed information about buildings. **A** summary of the input parameters of BEM-TEB for this case study is presented in Table **3.3.**

As it was previously done with the **CS** (section 2.4.4), electricity consumption, natural gas consumption, and anthropogenic heat fluxes from the **CAPITOUL** experiment are compared to BEM-TEB simulation results for two months in winter (Fig. **3.9).** Electricity and natural gas consumption computed as MBE and RMSE between BEM and observations are presented in Table **3.2.** The RMSE of electricity consumption is  $5.1 \text{ W m}^{-2}$ , averaged over the urban area, where the average electricity consumption calculated by the model is  $30.8 \text{ W m}^{-2}$ . A similar RMSE of gas consumption is obtained,  $7.4 \text{ W m}^{-2}$ . It can be seen that BEM-TEB slightly underpredicts electricity and gas consumption in this comparison, which can be due to internal heat gains not accounted for in the analysis, such as cooking and domestic hot water.



Figure 3.9 – Daily-average electricity consumption (top-left), natural gas consumption (top-right), and anthropogenic heat (bottom) per unit of urban area from observations and calculated **by** BEM-TEB in winter for the dense urban center of Toulouse.

#### **3.3.4 Comparison with field data from Athens, Greece**

Field data from a second experiment is used to evaluate BEM-TEB in summer. This experiment was carried out in Athens (Greece) between May and September **2009,** framed in the European project BRIDGE [Synnefa et al., 2010, 2011]. Indoor air temperatures were measured in representative residential buildings of the Egaleo neighborhood. Sensors were placed in the center of the living room of an intermediate floor, at a height of about 1 m above the floor. Outdoor air temperatures were simultaneously monitored **by** a meteorological station located at the municipality of Egaleo. Three of the monitored buildings share similar input parameters in BEM-TEB (Table 3.4) and are used in this comparison.

The three analyzed buildings were built between **1945-1965** (Fig **3.10).** They are made of reinforced concrete with no insulation and single-pane windows. In summer, buildings are naturally ventilated and provided with exterior window shades. The geometry and construction parameters of this case study were reported in the experiments. Typical values of internal heat gains and infiltration for residential buildings are assumed. Reasonable modeling assumptions are made in terms of shades and natural ventilation operation (Table 3.4). **A** low pressure coefficient difference is chosen to represent the impediment to air movement imposed **by** interior partitions.

The measured indoor air temperatures are compared to BEM simulation results for two months in summer (Fig. **3.11).** Indoor air temperatures in naturally-ventilated buildings are very sensitive to occupant behavior (e.g. occupation schedules, shades and window operation); thus, even if the buildings have similar parameters in terms of the simulation, their performance can be significantly different. As can be seen, BEM is able to reproduce the daily-average evolution, as well as the daily cycle amplitude, of indoor air temperatures measured in building 1 with an RMSE of **1.1** K (Table **3.2),** but it overestimates the indoor air temperatures measured in building 2 and, to a lesser extent, those measured in building **3.** This can be explained **by** the fact that building **1** performs more in phase with the outdoor environment than building 2, which means that building **1** has less fluctuations of internal heat gains and human building operation and, therefore, can be better captured **by** the simulation. Compared to building **1,** BEM slightly overestimates the indoor air temperature during daytime (positive MBE), probably because BEM does not consider occupation schedules, which would decrease internal heat gains during working hours.



Figure **3.10 -** Images of the buildings used in the comparison between BEM-TEB and the experiment carried out in the Egaleo neighborhood of Athens. *Source:* Synnefa et al. **[2011].**

**Table 3.4 -** Simulation parameters used in the comparison between BEM and observations. This configuration represents an urban area composed of residential buildings in the Egaleo neighborhood in Athens, Greece. The thermal properties of construction materials are indicated in Table 2.2.





Figure 3.11 - Daily-average (left) and monthly-average diurnal cycle (right) of indoor air temperature from observations and calculated **by** BEM-TEB from June **30** to August **30, 2009,** for the Egaleo neighborhood of Athens. Observations correspond to three different residential buildings. Daily-average outdoor air temperatures are also represented (left).

 $\label{eq:2.1} \mathcal{L}(\mathcal{L}^{\text{max}}_{\mathcal{L}}(\mathcal{L}^{\text{max}}_{\mathcal{L}})) \leq \mathcal{L}(\mathcal{L}^{\text{max}}_{\mathcal{L}}(\mathcal{L}^{\text{max}}_{\mathcal{L}}))$ 

# **Chapter 4**

# **The RC model for the analysis of the energy interactions between buildings and the urban climate**

#### **4.1 Overview**

This chapter presents an urban canopy and building energy model based on a thermal network of constant resistances and capacitances. The benefits of the RC model with respect to the more detailed models previously presented (chapters 2 and **3)** are its simplicity and computational efficiency. The model represents the fundamental physical mechanisms that govern the reciprocal energy interactions between buildings and the urban environment, retaining the sensitivity to the design parameters typically used in building energy and urban climate studies. The RC model is based on a state-space formulation that can be very efficiently solved **by** a numerical program. This allows for faster parametric analyses and makes it possible to easily evaluate modeling hypotheses.

In this chapter, the RC model is described and evaluated against the Coupled Scheme **(CS)** between EnergyPlus and TEB (chapter 2) for summer and winter and for different scenarios of waste heat emissions. The model is then used in a series of parametric analyses to investigate the impact of the **UHI** effect on the energy consumption of buildings for different building configurations. The model is also used to investigate the dominant mechanisms **by** which the indoor environment and the energy performance of buildings affect outdoor air temperatures. The conclusions of this study can be applied to a wide range of building and urban configurations.

#### **4.2 Model description**

Figure 4.1 shows the thermal network that represents the energy interactions within and between the indoor and outdoor environments. The indoor environment is defined as a single-zone building with an internal thermal mass. The outdoor environment is defined **by** an average-oriented urban canyon, composed of a generic fagade and a generic road. Other urban canyon and building energy models, such as BEM-TEB (chapter **3),** solve a very similar thermal network. The main difference is that, in the RC model, the state-space formulation solves the thermal network once for the whole simulation period instead of solving it at each time step.

#### *CHAPTER 4. THE RC MODEL FOR THE ANALYSIS OF THE ENERGY INTERACTIONS BETWEEN BUILDINGS AND THE URBAN CLIMATE*



Figure **4.1 -** Representation of an urban canopy and building energy model based on a thermal network of constant resistances and capacitances. **A** capacitance is associated with each temperature node. Nodes are connected **by** resistances. The heat sources of each node are represented **by** arrows. Four nodes are used to calculate the heat transfer through the wall, the roof and the road.

#### **4.2.1** Physics

The RC model represents the following heat transfer phenomena and calculations:

- Transient heat conduction through building walls and roof.
- Steady state heat conduction through windows.
- Solar transmission through windows.
- Heat storage in intermediate floor constructions.
- Longwave radiant heat exchange among interior surfaces (wall, roof, and mass).
- Sensible heat balance of the indoor air, including the convective heat fluxes from walls, windows, roof, and intermediate floors, the convective fraction of internal heat gains, the heat fluxes due to infiltration and ventilation air, and the heat fluxes from the **HVAC** system.
- Sensible heat balance of the urban canyon air, including the convective heat fluxes from walls, windows and the road, the sensible heat exchange between the canyon air and the atmosphere, the heat fluxes due to exfiltration and exhaust air, and the waste heat from **HVAC** equipment.
- **"** Solar radiation absorbed **by** walls, roof, and road assuming an average orientation of an urban canyon (see appendix **D).**
- Heat storage in the road soil.
- **"** Wall-sky, road-sky, roof-sky, and wall-road longwave radiant heat exchanges, taking into account the view factors between each pair of elements. This represents the longwave trapping of urban canyons due to reduced sky view factors.

#### 4.2.2 Assumptions

The objective of the RC model is to capture the fundamental physical mechanisms that govern the indoor and outdoor energy interactions, while keeping a state-space formulation that can be efficiently solved. This implies constant resistances in the thermal network represented in Fig. **4.1.**

The rate of heat exchange between the urban canyon air and the atmosphere is usually characterized by an exchange velocity  $u_{ex}$ , which can be defined as:

$$
u_{ex} = \frac{H_{urb}}{\rho c_P (T_{urb} - T_{atm})},\tag{4.1}
$$

where  $H_{urb}$  is the sensible heat exchange between the urban canyon and the atmosphere,  $T_{urb}$  is the urban canyon mean air temperature, and *Tarm* is the air temperature above the urban canopy layer. Preliminary results obtained with the RC model showed that urban canyon air temperatures are sensitive to the exchange velocity values. Different methods are proposed in the literature to calculate exchange velocities. In this version of the RC model, the correlations of Louis **[1979]** are used **(Eq. C.13** in appendix **C).** In this method, exchange velocities depend on the Richardson number, which is a measure of the air stability inside the canyon and is a function of the canyon air temperature calculated **by** the RC model. Therefore, an iteration of the RC model is required to match the input and calculated exchange velocities.

As a consequence of the state-space formulation, the RC model assumes that the convection heat transfer coefficients **(CHTC)** and the exchange velocities remain invariant during the simulation. In detailed urban canopy and building energy models (e.g. **CS** and BEM-TEB), the **CHTC** can be calculated **by** correlations as a function of the wind speed and surface-air temperature difference. Exchange velocities usually depend on geometry, roughness length for momentum and heat, wind speed, and atmospheric stability. Even so, the RC model is able to reproduce the average diurnal cycle of the results of more sophisticated models **by** using the average exchange velocity calculated **by** correlations for the simulation period.

Other assumptions of the RC model include:

- Constant indoor air temperature.
- **"** Constant infiltration and ventilation air flowrate.
- **"** Constant internal heat gains.
- **"** Single-zone building with intermediate floors represented as an internal thermal mass. The transmitted solar radiation and the radiant fraction of internal heat gains are perfectly absorbed **by** the internal thermal mass and then are released into the indoor environment.
- **"** Adiabatic building floor. This condition is reasonable if the floor is well insulated.
- **"** Ideal **HVAC** system: the energy supplied **by** the system equals the building energy demand, and the energy consumption is calculated from a constant efficiency. The dependence of the **COP** of cooling systems on outdoor air temperatures is included in BEM-TEB (chapter **3).**
- **"** Well-mixed air inside the urban canyon. This is a reasonable assumption for relatively homogenous urban canopies composed of low-rise to medium-rise buildings. Building, cars, and other heat sources keep a positive buoyancy level inside urban canyons, even at night, and enhance the mixing of air inside the urban canopy.
- **"** Linearized radiation formulation and one-bounce approximation for indoor and outdoor longwave radiative heat exchanges.
- **"** Air temperatures at the top of the urban canopy layer are boundary conditions of the model and therefore not affected **by** the heat fluxes from the canopy. This assumption is relaxed in chapters *5* and **6,** and its effect is discussed.
- \* No sensible-to-latent conversion due to vegetation or other mechanisms. **A** simple urban vegetation model is presented in chapter **6.**
- **"** The water vapor of the urban canyon air does not participate in the radiant heat balance. This assumption is relaxed in chapter **6** to account for humid climates.

These assumptions have a small or no effect on the conclusions obtained with the RC model in this chapter. **A** systematic error will cancel when comparing different simulations with the RC model.

#### **4.2.3 State-space formulation**

**The RC** model is derived from energy conservation principles. For each capacitance node (Fig. **4.1),** the rate of change of its internal energy is related to the heat fluxes reaching the node. This can be generally expressed as:

$$
C_j \frac{dT_j}{dt} = \sum_k \frac{1}{R_k} (T_k - T_j) + \sum Q_j,
$$
\n(4.2)

where  $C_i$  and  $T_i$  represent the capacitance and temperature of the node *j*,  $R_k$  and  $T_k$  represent the resistance and temperature of the nodes  $k$  that interact with the node  $j$ , and  $Q_j$  represents the heat fluxes acting on the node **j.**

Using these relations, a state-space formulation can be set up and efficiently solved **by** a numerical simulation tool. The general formulation can be written as:

$$
\frac{dT_j(t)}{dt} = AT_j(t) + Bu_j(t),\tag{4.3}
$$

where  $T_i(t)$  is a vector of state variables that correspond to each of the temperature nodes associated with a capacitance,  $u_i(t)$  is a vector of inputs that can be known temperatures or heat fluxes, and A and *B* are coefficient matrices.

#### **4.2.4 Heat fluxes**

The transmitted solar radiation is obtained **by** multiplying the solar radiation that reaches the averageoriented wall **by** a constant window transmittance provided **by** the user (see section 3.2.4).

In the case of a cooling situation, waste heat from the outdoor equipment is released into the outdoor environment ( $Q_{waste}$ ). The waste heat is calculated as a function of the cooling energy demand of the building *(Qdem)* and the energy consumed **by** the **HVAC** system to dehumidify the air that passes through the cooling coil *(Qlat):*

$$
Q_{waste} = f(Q_{dem} + Q_{lat}), \qquad (4.4)
$$

where the function *f* depends on the coefficient of performance *(COP)* of the cooling system,  $f =$  $(1 + 1/COP)$ . The dehumidification energy  $(Q<sub>lat</sub>)$  is obtained by assuming that the air enters the cooling coil at indoor conditions and leaves the cooling coil at supply temperature and at **90%** relative humidity. Then,

$$
Q_{lat} = m_{sys}l_v(q_{in} - q_{sys}),
$$
\n(4.5)

where  $m_{sys}$  is the supply mass flowrate;  $l_v$  is the water condensation heat;  $q_{sys}$  is the supply specific humidity, calculated from the supply temperature  $(T_{sys})$  and 90 % RH; and  $q_{in}$  is the indoor specific humidity, calculated from the set point of temperature and relative humidity provided **by** the user. To obtain the supply mass flowrate, the model requires the maximum sensible cooling load of the building, which is calculated through the simulation. Therefore, an iteration of the RC model is required in order to calculate waste heat emissions.

#### *4.2.5* **Boundary conditions, inputs and outputs**

As boundary conditions, the RC model requires time-step values of air temperatures and wind speed at the top of the urban canyon (above the urban canopy layer), solar heat fluxes over the horizontal, and incoming longwave radiation or equivalent sky temperature. The inputs of the model are construction and geometric information, internal heat gains, indoor thermal and humidity set points, supply air temperature of the **HVAC** system, maximum sensible cooling load calculated through iteration of the model, **CHTC** of the different surfaces, and exchange velocity between the urban canyon and the atmosphere calculated through iteration of the model (see Table 4.1 for specific inputs). The outputs of the model are the average diurnal cycles of node temperatures, heat fluxes, building energy demand, and waste heat emissions for the simulation period.

#### **4.3 Model evaluation**

In this section, the RC model is compared with the EnergyPlus-TEB Coupled Scheme **(CS)** (chapter 2). The **CS** was evaluated with field data from the experiment **CAPITOUL** conducted in Toulouse (France) from February 2004 to March **2005** [Masson et al., **2008].** The same case study is used for the evaluation of the RC model but assuming that **AC** systems are widely used in summer. Table 4.1 describes the inputs of the RC model used in this study.

Three different case studies are compared (Table 4.2). The first two cases are summertime simulations of a residential and a commercial building, respectively. The third case corresponds to a wintertime

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**Table 4.1 -** Inputs of the RC model used in the comparison of the model with the **CS.** This configuration represents the dense urban center of Toulouse (France) assuming **AC** systems are used in summer. The thermal properties of construction materials are summarized in Table 2.2. The term **fl** indicates unit of floor area.



simulation of a residential building. The average diurnal cycles calculated **by** the RC model and the **CS** for **15** days in summer and **15** days in winter are compared.

#### **4.3.1 Building energy demand**

Figure 4.2 compares the sensible cooling energy demand in summer and the heating energy demand in winter calculated **by** the RC model and the **CS.** The root-mean-square error (RMSE) and mean-bias error (MBE) of the comparison is presented in Table 4.3. As can be seen, the RC model is able to reproduce the average diurnal cycle of building energy performance predicted **by** the **CS** with RMSE between 0.3 and 1.8 W  $m^{-2}$  of floor area. These values are much lower than the average building energy demand calculated **by** the **CS** for the simulation period, which is taken as the reference value (REF)

**Table** 4.2- Case studies used in the comparison of the RC model with the **CS,** and inputs of the RC model obtained through iteration for each case study. In winter, the model assumes that there are no waste heat emissions from **HVAC** systems.

Parameter	Case 1	Case 2	Case 3
Season	Summer	Summer	Winter
Internal heat gains	<b>Residential</b>	Commercial	Residential
Parameters obtained through iteration			
Exchange velocity	$0.29 \text{ m s}^{-1}$	$0.31 \text{ m s}^{-1}$	$0.30 \text{ m s}^{-1}$
Maximum sensible cooling load	$11.3 W m-2 fl$	$32.3 \text{ W m}^{-2} \text{ fl}$	÷.

to which evaluate errors. The RMSE associated with the transmitted solar radiation calculated **by** both models ranges between 1.3 and 1.8 W m<sup>-2</sup> of floor area. Negative MBE values of transmitted solar radiation indicate that the RC model overestimates this parameter systematically. In addition, the solar transmission error is high compared to its reference value, which can be explained **by** the simplifications made in the RC model for its calculation. Interior wall and mass surface temperatures are well captured **by** the RC model with RMSE between **0.0** and **0.6** K.



Figure 4.2 - Average diurnal cycle of sensible cooling energy demand of case 1 (top-left) and case 2 (top-right) for summer, July **15 -** July **30,** and average diurnal cycle of heating energy demand of case **3** (bottom) for winter, February 1 **-** February **16,** calculated **by** the RC model and **by** the **CS.**

#### **4.3.2 HVAC waste heat emissions**

Figure 4.3 shows the average diurnal cycle of waste heat emissions in summer calculated **by** the RC model and the **CS.** As can be seen, the RC model is able to reproduce the waste heat emissions predicted by the CS with RMSE around  $6.5 W m^{-2}$  of urban area, where the average waste heat flux calculated by the CS is 55 W  $\text{m}^{-2}$  for the residential case and 220 W  $\text{m}^{-2}$  for the commercial case.



Figure 4.3 **-** Average diurnal cycle of **HVAC** waste heat emissions of case 1 (left) and case 2 (right) for summer, July **15 -** July **30,** calculated **by** the RC model and **by** the **CS.**

#### 4.3.3 **Urban air temperatures**

Figure 4.4 represents the average diurnal cycle of air temperatures inside the urban canyon calculated **by** the RC model, the **CS,** and the TEB scheme. In case **1,** in which waste heat emissions are around 55 W  $\mathrm{m}^{-2}$  of urban area, the three models predict similar urban air temperatures. The RMSE between the RC model and the **CS** is 0.4 K, where the average temperature difference between the canyon and the atmosphere is 1.2 K. Case 2 presents waste heat emissions of around 220 W  $\text{m}^{-2}$  of urban area, and the urban air temperatures calculated **by** the RC model and the **CS** are around 1 K higher than those calculated **by** the TEB model, which does not account for waste heat emissions. The RMSE between the RC model and the **CS** is also 0.4 K, being the reference value 2.1 K. These relative errors are acceptable given the important uncertainties related to urban climate predictions.

In winter (case **3),** the three models predict similar urban air temperatures. The RMSE between the RC model and the **CS** is *0.5* K, for which the reference canyon-atmosphere temperature difference is **0.7** K. Although the relative difference between the error and the reference value is higher in wintertime, the fact that for the three cases the error is very similar suggests that this is systematic and probably related to the different methods used to calculate exchange velocities. **A** systematic error will cancel when comparing different simulations with the RC model, as in the parametric analyses of the following sections.

In terms of wall and road surface temperatures, the RMSE between RC and **CS** ranges between **1.7** K and **0.6** K. The reference values for these parameters can be of the same magnitude or even lower, which can be explained **by** the generic values of **CHTC** used as inputs of the model. **A** better agreement of surface temperatures can be obtained **by** using the average **CHTC** calculated **by** the **CS.** However, these simulations show that these differences in surface temperatures do not have a significant effect on urban air temperatures.



Figure 4.4 – Average diurnal cycle of urban air temperatures of case 1 (top-left) and case 2 (top-right) for summer, July **15 -** July **30,** and of case **3** (bottom) for winter, February 1 **-** February **15,** calculated **by** the RC model, **by** the **CS,** and **by** the TEB scheme.





## **4.4 Impact of the UHI effect on the energy performance of buildings**

In this section, the RC model is used to analyze the impact of the **UHI** effect on the energy performance of buildings. **A** series of simulations is carried out imposing outdoor conditions *(Turb)* to the RC model. This is achieved **by** using outdoor temperatures as boundary conditions at the top of the urban canyon and introducing a high exchange velocity between the urban canyon and the atmosphere. The outdoor conditions used in this analysis correspond to an **UHI** scenario measured during the **CAPITOUL** experiment (Table 4.4). The dependence of the building energy performance to other **UHI** scenarios is also tested.

**Table 4.4 -** Nighttime and daytime maximum urban-rural temperature differences that characterize the diurnal cycles of **UHI** effect used to analyze its impact on the energy performance of buildings.



Five case studies are analyzed (Table *4.5).* The first three cases are simulated using summer outdoor conditions and the last two using winter outdoor conditions. Cases **1,** 2, 4, and *5* correspond to a residential building with and without insulated walls. Case **3** corresponds to a commercial building with insulated walls.

**Table** *4.5* **-** Case studies used to analyze the interactions between buildings and the urban environment. In the insulated cases, the building wall is composed of **30** cm brick and an inner layer of **3** cm insulation. In the uninsulated cases, the building wall is composed of **30** cm brick. Internal heat gain values for the residential and commercial cases, as well as other building and urban parameters are defined in Table **4.1.**



Figure *4.5(left)* shows the daily-average change in sensible energy demand due to the **UHI** effect for different building glazing ratios. In Fig. *4.5(right),* the energy demand change is divided **by** the actual energy demand of the building. The graphs show the absolute value of the change in energy demand, which is positive in summer and negative in winter. Fig. 4.5(left) shows that the **UHI** effect has a greater impact on the building energy performance for higher glazing ratios. As expected, the slope is lower for the cases in which walls are not insulated, and there is a convergence in energy demand change between insulated and uninsulated cases for higher glazing ratios. The fact that the ratio of energy demand change due to the **UHI** effect is decreasing in summer for higher glazing ratios is explained **by** the fact that the overall building energy demand increases faster than the energy demand change due to the **UHI** effect for higher glazing ratios. The results show a small influence of the glazing ratio and wall insulation on the ratio of energy demand change due to the **UHI** effect.

Figure *4.6* shows the daily-average ratio of energy demand change due to the **UHI** effect for different infiltration air flowrates and vertical-to-horizontal building area ratios. Infiltration heat gains can be an important fraction of the building energy demand, above all in winter when the temperature difference



Figure 4.5 **-** Daily-average change in sensible energy demand due to the **UHI** effect for different building glazing ratios. The following cases are analyzed: **1.** summer, residential, insulated walls; 2. summer, residential, uninsulated walls; **3.** summer, commercial, insulated walls; 4. winter, residential, insulated walls; and **5.** winter, residential, uninsulated walls. Results are given in absolute form (left) and relative form (right) divided **by** the overall sensible building energy demand. Other parameter settings are  $T_{in} = 22 \degree \text{C}$ ,  $V H_{bld} = 2$ , and  $V_o = 0.5$  ACH.

between indoor and outdoor environments is high. The **UHI** effect modifies the heat gain due to infiltration, increasing the cooling energy demand in summer and decreasing the heating energy demand in winter. The vertical-to-horizontal building area ratio determines the relative amount of building surface area exposed to the outdoor environment and, therefore, affected **by** the UHI effect **by** means of heat transmission through walls and windows. The graphs show a significant influence of the infiltration level and weak dependence on the vertical-to-horizontal building area ratio. Having more building surface exposed to the outdoor environment usually implies more infiltration through opening cracks, but this effect is not taken into account in this analysis. The results suggest that the main mechanism **by** which the **UHI** effect influences the indoor environment is the outdoor air entering the building, which can be produced **by** infiltration but also **by** natural or forced ventilation. The **UHI** impact from the conductive heat transfer through the building enclosure is relatively small.

Different UHI effect scenarios are represented in Fig. 4.7. The ratio of energy demand change due to these **UHI** effect scenarios is indicated in Fig 4.8, which shows a linear relationship. For residential buildings in summer, the results show a **5%** increase in cooling energy demand per 1 K increase in the maximum UHI effect at night. **A** similar order-of-magnitude decrease in heating energy demand is also produced **by** an equivalent wintertime **UHI** effect. The energy demand of commercial buildings, usually dominated **by** internal heat gains, are less influenced **by** the outdoor environment, and therefore not significantly affected **by** the UHI effect if they do not have building systems with a close interaction with the outdoor environment such as economizers or natural ventilation.



Figure 4.6 **-** Daily-average change in sensible energy demand due to the **UHI** effect divided **by** the overall sensible building energy demand for different infiltration air flowrates (left) and vertical-to-horizontal building area ratios (right). The following cases are analyzed: **1.** summer, residential, insulated walls; 2. summer, residential, uninsulated walls; **3.** summer, commercial, insulated walls; 4. winter, residential, insulated walls; and *5.* winter, residential, uninsulated walls. Other parameter settings are  $T_{in} = 22 \degree \text{C}$ ,  $GR = 0.4$ ,  $VH_{b1d} = 2$ , and  $V_o = 0.5$  ACH.



Figure 4.7 **-** Diurnal cycles of urban air temperature in summer (left) and in winter (right) for different maximum urban-rural air temperature difference.

### 4.5 **Impact of the energy performance of buildings on the outdoor environment**

In this section, a parametric analysis is carried out with the RC model to investigate the impact of the indoor energy performance on urban air temperatures. Table 4.6 summarizes the boundary conditions above the urban canyon used in this analysis. The summer and the winter design days correspond to a hot and a cold day, respectively, measured in Toulouse during the CAPITOUL experiment. The average wind speed above the urban canyon is set to 5 m  $s^{-1}$ . The dependence of outdoor temperatures to this parameter is also tested. The same five case studies presented in the previous section are analyzed (Table *4.5).*



Figure **4.8 -** Daily-average ratio of energy demand difference for different maximum urban-rural air temperature difference. The following cases are analyzed: **1.** summer, residential, insulated walls; 2. summer, residential, uninsulated walls; **3.** summer, commercial, insulated walls; *4.* winter, residential, insulated walls; and **5.** winter, residential, uninsulated walls. Other parameter settings are  $T_{in} = 22 \degree \text{C}$ ,  $GR = 0.4$ ,  $VH_{bld} = 2$ , and  $V_o = 0.5$  ACH.

Table 4.6 – Meteorological conditions above the urban canyon used to analyze the impact of the energy performance of buildings on the outdoor environment.

	Summer	Winter
Design day	07/31/04	01/26/05
Maximum air temperature	$35.1\text{ °C}$	$-0.2$ °C
Daily air temperature range	15.6 K	2.8 K
Average wind speed	$5.0 \text{ m s}^{-1}$	$5.0 \text{ m s}^{-1}$

#### **4.5.1 Effect of the indoor environment without waste heat emissions**

Without considering waste heat emissions, **a** change in the indoor thermal conditions can affect the outdoor environment **by** heat conduction through the building enclosure, which modifies outdoor surface temperatures and end up affecting outdoor air temperatures **by** convective heat transfer. **A** change in the indoor environment can also have an impact on outdoor air temperatures through exfiltration. Assuming that all the air that enters a building through infiltration leaves it at indoor air temperature, there is an exfiltration heat flux associated with the indoor-outdoor temperature difference, which is more important in winter than in summer.

Figure *4.9(left)* shows the daily-average difference in outdoor air temperature due to an increase in the indoor air temperature of *5* K in summer and in winter for different building glazing ratios. As can be seen, indoor air temperatures have a small influence on the outdoor environment when there are no waste heat emissions from **AC** systems and no exfiltration heat.

Figure 4.9(right) shows the daily-average difference in outdoor air temperature due to a change in the exfiltration air flowrate from **0.0** to *0.5* **ACH** for different indoor air temperatures. As can be seen, exfiltration has an unimportant influence on the outdoor environment in summer, but it might be relevant in some winter situations. Due to the high indoor-outdoor temperature difference, the exfiltration heat flux can be compared to other urban fluxes in a cloudy day in winter.



**Figure** 4.9 **-** Daily-average difference in outdoor air temperature due to a change in indoor air temperature from 22 **'C** to **27 'C** in summer and from **17 'C** to 22 **'C** in winter for different building glazing ratios (left). Daily-average outdoor air temperature difference due to a change in exfiltration air flowrate from **0.0** to *0.5* **ACH** for different indoor air temperatures in summer and in winter (right). The following cases are analyzed: **1.** summer, residential, insulated walls; 2. summer, residential, uninsulated walls; **3.** summer, commercial, insulated walls; 4. winter, residential, insulated walls; and *5.* winter, residential, uninsulated walls. Other parameter settings are *Pbld = 0.5,*  $VH_{urb} = 1$ ,  $GR = 0.4$ ,  $f_{waste} = 0.0$ , and  $V_o = 0.0$  ACH.

#### 4.5.2 Effect of waste heat emissions

Waste heat emissions from **HVAC** systems are significant sources of heat in the energy balance of an urban canyon. Fig. 4. 10(left) shows the daily-average difference in outdoor air temperature due to the waste heat from **AC** systems in summer for different indoor air temperature values. Daily-average waste heat emissions are represented in Fig. 4. 10(right). Commercial buildings, due to their high internal heat gains, have a greater impact on the outdoor environment.



**Figure 4.10 -** Daily-average difference in outdoor air temperature due to waste heat emissions (left) and waste heat emissions in summer for different indoor air temperatures (right). The following cases are analyzed: **1.** summer, residential, insulated walls; 2. summer, residential, uninsulated walls; and **3.** summer, commercial, insulated walls. Other parameter settings are  $\rho_{bld} = 0.5$ ,  $VH_{urb} = 1$ ,  $V_o = 0.5$  ACH, and  $GR = 0.4$ .

Figure 4.11 represents the daily-average difference in outdoor air temperature due to waste heat emissions for different building densities. This parameter, typically used in urban planning, has a significant impact on outdoor air temperatures. This can be seen **by** the fact that to condition bigger indoor spaces
in summer implies pumping more heat into a smaller outdoor environment, and therefore outdoor air temperatures soar.



Figure 4.11 - Daily-average difference in outdoor air temperature due to waste heat emissions (left) and waste heat emissions (right) in summer for different building densities. The following cases are analyzed: **1.** summer, residential, insulated walls; 2. summer, residential, uninsulated walls; and **3.** summer, commercial, insulated walls. Other parameter settings are  $VH_{urb} = 1$ ,  $V_o = 0.5$  ACH,  $GR = 0.4$ , and  $T_{in} = 22 \text{ °C}$ .

The wind speed above the urban canopy affects the heat exchange rate between the urban canyon and the atmosphere through the average exchange velocity used in the RC model. Fig. 4.12 shows the dependence of the urban canyon air temperature change due to waste heat emissions on the wind speed above the urban canopy. For the residential cases, in which waste heat emission are around **100** W m-2 of urban area, the increase in outdoor temperature ranges between *0.5* K for a wind speed of **10** m s-1 and 1 K for a wind speed of 2 m  $s^{-1}$ . For the commercial case, in which the average waste heat flux is  $220 \text{ W m}^{-2}$  of urban area, the increase in outdoor temperature ranges between 1.2 K for a wind speed of 10 m s<sup>-1</sup> and 2.2 K for a wind speed of 2 m s<sup>-1</sup>. It can be concluded that, for building densities lower than **0.6,** the increase in outdoor air temperature is approximately proportional to the heat flux per unit of urban area released into the urban canyon with a relation of 1 K per 100 W m<sup>-2</sup> for low wind speeds and 0.5 K per  $100 \text{ W m}^{-2}$  for high wind speeds.

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**Figure 4.12 -** Daily-average difference in outdoor air temperature due to waste heat emissions in summer for different wind speeds above the urban canopy layer. The following cases are analyzed: **1.** summer, residential, insulated walls; 2. summer, residential, uninsulated walls; and **3.** summer, commercial, insulated walls. Other parameter settings are  $\rho_{bld} = 0.5$ ,  $VH_{urb} = 1$ ,  $V_o = 0.5$  ACH,  $GR = 0.4$ , and  $T_{in} = 22$  °C.

**Urban climate prediction tool**

 $\label{eq:2.1} \frac{1}{\sqrt{2}}\int_{\mathbb{R}^3}\frac{1}{\sqrt{2}}\left(\frac{1}{\sqrt{2}}\right)^2\frac{1}{\sqrt{2}}\left(\frac{1}{\sqrt{2}}\right)^2\frac{1}{\sqrt{2}}\left(\frac{1}{\sqrt{2}}\right)^2\frac{1}{\sqrt{2}}\left(\frac{1}{\sqrt{2}}\right)^2.$ 

# **Chapter 5**

# **The Urban Boundary-Layer model**

# **5.1 Overview**

Urban Canopy and Building Energy Models **(UC-BEM),** such as those presented in chapters 2, **3,** and 4, require meteorological information above the urban canopy layer as boundary conditions for their calculations. This information can be provided on-line if the **UC-BEM** is dynamically coupled with a mesoscale atmospheric model, but can also be measured or simulated off-line (as done in previous chapters). The off-line approach takes advantage of the low computational cost of UC-BEMs in order to effectively perform parametric analyses of urban design criteria. However, this approach assumes that the urban boundary layer is not affected **by** changes in the urban surface, which is a restrictive assumption if one is interested in contrasted scenarios of urban heat fluxes. Furthermore, meteorological information above the urban canopy layer is only available through short-term experiments, a few permanent urban stations, and mesoscale atmospheric simulation results. This limits the use of UC-BEMs **by** other communities, such as building engineers and urban planners, who may be interested in urban climate prediction but do not have access to this type of information. On the other hand, meteorological information can be easily found in weather data files obtained from measurements at operational weather stations, usually located in open areas outside the city (e.g. airports).

This chapter presents a methodology to calculate air temperatures above the urban canopy from measurements at operational weather stations. The methodology is physically based and has a computational cost equivalent to UC-BEMs. At each time-step, an Urban Boundary-Layer **(UBL)** model calculates air temperatures above the urban canopy layer **by** solving an energy balance for a control volume inside the urban boundary layer. The model requires meteorological information measured at an operational weather station (air temperature at 2 m and wind speed at **10 m),** surface sensible heat fluxes, and air temperatures at two different heights above the weather station provided **by** a Vertical Diffusion Model (VDM). The VDM calculates vertical profiles of air temperature **by** solving a one-dimensional transient heat diffusion equation. The VDM requires measurements at the operational weather station and rural sensible heat fluxes.

The chapter first describes the physics behind the **UBL** model and the VDM. Then, both models are evaluated separately **by** comparing them with three-dimensional high-resolution numerical simulations of an idealized city. These simulations are carried out **by** climatologists at the **CNRM-GAME** (France) with the Nonhydrostatic Mesoscale **(MESO-NH)** atmospheric model [Lafore et al., **1998].** Then, the coupled VDM-UBL scheme is evaluated against field data from two boundary-layer experiments, one carried out in Basel, Switzerland, in 2002 [Rotach et al., *2005];* and another one carried out in Toulouse, France, during 2004 and **2005** [Masson et al., **2008].**

## **5.2 Model description**

The objective of this model is to describe the diurnal evolution of the **UHI** effect at mesoscale level based on an idealized conceptual model of rural and urban boundary layers as described in Hidalgo et al. **[2009]** (Fig. *5.1).* At nighttime, the longwave radiation exchange between the rural surface and the sky keeps the boundary layer stratified. In contrast, due to the thermal inertia of urban areas and the anthropogenic sources of heat, the nighttime urban boundary layer is mixed. At daytime, the solar radiation heats the rural and urban surfaces and the atmosphere is well mixed up to a high altitude [Stull, **1988].** As a result, the **UHI** effect (urban-rural air temperature difference) presents a marked diurnal cycle with positive values at nighttime, negative values during the morning, and weak positive values during the afternoon [Oke, **1987].**



Figure **5.1 -** Representation of a city and the physical domain of the four modules that compose the Urban Weather Generator (chapter **6):** the Rural Station Model (RSM), the Vertical Diffusion Model (VDM), the Urban Boundary Layer **(UBL)** model, and the Urban Canopy and Building Energy Model **(UC-BEM).** The diagram represents nighttime (left) and daytime conditions (right) (not at scale). The VDM calculates vertical profiles of potential temperature  $(\theta_{rur})$  at the rural site. The UBL model solves an energy balance at the urban boundary layer between the blending height  $(z_r)$  and the boundary-layer height  $(z_i)$  to calculate air temperatures above the urban canopy layer.

This chapter uses the concept of potential temperature, which is a magnitude commonly used in meteorology to compare air temperatures at different heights without including the differences in pressure. Potential temperature is defined as the temperature that a parcel of fluid at a certain pressure would acquire if is brought adiabatically to a standard reference pressure.

#### **5.2.1 Urban Boundary-Layer Model**

The **UBL** model is based on an energy balance for a selected control volume inside the urban boundary layer delimited **by** the blending height *(zr),* at which the influences of individual obstacles on vertical profiles or fluxes become horizontally blended, and the boundary-layer height (zi) (Fig. *5.1).* It differentiates between nighttime and daytime urban boundary layers, and between the advection effect driven **by** a geostrophic wind (forced problem) and **by** the urban breeze circulation (buoyancy-driven problem) [Hidalgo et al., **2008].**

The energy balance of the **UBL** model is expressed as:

$$
V_{CV}\rho c_v \frac{d\theta_{urb}}{dt} = H_{urb} + \int u_{ref}\rho c_p (\theta_{ref} - \theta_{urb}) dA_f, \qquad (5.1)
$$

where  $V_{CV}$  is the control volume,  $\rho$  is the air density,  $c_v$  is the air specific heat at constant volume,  $c_p$  is the air specific heat at constant pressure,  $\theta_{urb}$  is the average potential temperature of the control volume,  $H_{urb}$  is the sensible heat flux at the surface of the control volume [W],  $\theta_{ref}$  is a reference potential temperature outside the control volume,  $u_{ref}$  is a reference air velocity, and  $A_f$  is the lateral area of heat exchange between the control volume and its surroundings. In **Eq.** *5.1,* the term on the **LHS** represents the thermal inertia of the control volume and the second term on the RHS represents the advection effect. The model assumes that the potential temperature is uniform inside the control volume and that there is no significant heat exchange at the top of it.

At daytime, a control volume of the size of the city and height  $[z_i]_{day}$  is selected. The reference temperature of **Eq.** *5.1* is taken as the potential temperature outside the city at a height at which the vertical profile is considered uniform,  $\theta_{rur}(z_{ref})$ . This temperature is provided by the VDM.

In presence of geostrophic wind, the reference velocity is taken as the air velocity measured at the weather station,  $u_{wind}(z_m)$  ( $z_m = 10$  m), and the lateral area of heat exchange,  $A_f$ , includes the width of the city orthogonal to the wind direction, *W.* Under urban-breeze circulation at daytime, Hidalgo et al. **[2009]** proposed the following expression for the characteristic circulation velocity *(ucirc):*

$$
u_{circ} = k_w \left( \beta z_i \frac{H_{urb} - H_{rur}}{\rho c_p} \right)^{1/3},\tag{5.2}
$$

where  $k_w$  is a constant  $(k_w \sim 1)$ ,  $\beta$  is the buoyancy coefficient  $(\beta = g\theta^{-1})$ , and  $H_{urb}$  and  $H_{run}$  are the sensible heat fluxes  $\lceil W \rceil^{-2} \rceil$  from the urban and the rural sites, respectively. The problem is assumed to be driven **by** buoyancy if the circulation velocity is greater than the air velocity measured at the weather station. For this situation, the circulation velocity **(Eq. 5.2)** is used in the energy balance and the lateral area of heat exchange includes its entire perimeter,  $P_{city}$ .

At night, in presence of geostrophic wind, the urban boundary layer is horizontally divided in various control volumes (Fig. *5.2).* For the first control volume, the one upstream of the city, the reference potential temperature and wind velocity are assumed to have the following linear vertical profiles:

$$
\theta_{rur}(z) = \left(\theta_{rur}(z_i) - \theta_{rur}(z_r)\right) \frac{z}{z_i} + \theta_{rur}(z_r),\tag{5.3}
$$

and

$$
u_{wind}(z) = u_{wind}(z_m) \frac{z}{z_m},
$$
\n(5.4)

where  $\theta_{rur}(z_r)$  is the air temperature measured at the weather station  $(z_r = 2 \text{ m})$ .  $\theta_{rur}(z_i)$  is provided by the VDM, where the boundary-layer height  $(z_i)$  is an input of the model. For simplicity, Eq. 5.4 assumes that the air velocity is zero at *Zr.* For the control volumes downstream of the first one, the reference temperature is assumed to be uniform and given **by** the temperature of the control volume immediately upstream.



Figure *5.2* **-** Representation of the nighttime-forced scenario of the **UBL** model, in which the urban boundary layer is horizontally divided in various control volumes.

Under urban-breeze circulation at nighttime, the circulation velocity obtained **by Eq. 5.2** is also used for the reference air velocity of **Eq.** *5.1,* although this velocity scale was initially developed for daytime conditions (indeed, the circulation velocity scale proposed **by** Lu et al. **[1997]** for nighttime is equivalent to **Eq.** *5.2).* The reference air temperature is assumed to have also a linear vertical profile **(Eq.** *5.3).*

To simplify the mathematical formulation of the **UBL** model, the height reference is taken at *Zr* (e.g.  $[z_i]_{model} = [z_i]_{real} - [z_r]_{real}$  and  $[z_r]_{model} = 0$ . The numerical method used to solve Eq. 5.1 is implicit Euler, in which  $\frac{d\theta_{urb}}{dt} = \frac{\theta_{urb} - \theta_{urb}}{\delta}$ , where  $\delta$  is the simulation time-step. Then, Eq. 5.1 can be expressed as:

$$
\theta_{urb} - \theta_{urb}^{-} = C_{surf} + C_{adv} \theta_{eq} - C_{adv} \theta_{urb},
$$
\n(5.5)

where  $C_{surf}$ ,  $C_{adv}$  and  $\theta_{eq}$  are calculated for each scenario according to Table 5.1.

**Table 5.1** – Surface coefficient  $(C_{surf})$ , advection coefficient  $(C_{adv})$ , and equivalent temperature  $(\theta_{eq})$  used in Eq. 5.5 for each scenario.  $\theta_{rur}$  is the potential temperature outside the city at different heights  $\{z_r, z_i,$  and  $z_{ref}\}$ .  $\theta_{n-1}$  is the average potential temperature of the control volume upstream of the one considered. *Hurb* is the urban sensible heat flux  $[W \, m^{-2}]$ .

Night	$C_{surf}$	$C_{adv}$	$\theta_{ea}$
Forced (first)	$H_{urb} \delta$ $z_i \rho c_v$	$u_{wind}(z_m)z_i\delta c_p$ $2z_m dxc_v$	$\frac{2}{3}\theta_{rur}(z_i) + \frac{1}{3}\theta_{rur}(z_r)$
Forced (rest)			$\theta_{n-1}$
Buoyancy-driven	$H_{urb} \delta$ $z_i \rho c_v$	$P_{city}u_{circ} \delta c_p$ $A_{city}c_v$	$\frac{1}{2}\theta_{rur}(z_i) + \frac{1}{2}\theta_{rur}(z_r)$
Day			
Forced	$H_{urb} \delta$ $z_i \rho c_v$	$Wu_{wind}(z_m)\delta c_p$ $A_{city}c_v$	$\theta_{rur}(z_{ref})$
Buoyancy-driven	$H_{urb} \delta$ $z_i\rho c_v$	$P_{city}u_{circ} \delta c_p$ $A_{city}c_v$	$\theta_{rur}(z_{ref})$

#### **5.2.2 Vertical Diffusion Model**

The VDM calculates the vertical profiles of potential temperature above the weather station **by** solving the following heat diffusion equation:

$$
\frac{\partial \theta(z)}{\partial t} = -\frac{1}{\rho(z)} \frac{\partial}{\partial z} \left( \rho(z) K_d(z) \frac{\partial \theta(z)}{\partial z} \right),\tag{5.6}
$$

where z is the vertical space component,  $\rho$  is the air density, and  $K_d$  is a diffusion coefficient. The lower boundary condition of Eq. 5.6 is the temperature measured at the weather station  $\theta(z_r)$ . The upper boundary condition accounts for the fact that at a certain height ( $z_{ref} \sim 200$  m), the profile of potential temperature is uniform and  $\frac{\partial \theta}{\partial z}\big|_{z_{ref}} = 0$ .

The difficulty of calculating vertical temperature profiles through a diffusion equation lies in the calculation of the diffusion coefficient  $K_d$ . In some atmospheric models, such as the MESO-NH model, this coefficient is related to the turbulent kinetic energy (TKE) at each vertical level [Bougeault and Lacarrere, **1989]:**

$$
K_d = C_k l_k E^{1/2},\tag{5.7}
$$

where  $E$  is the TKE,  $C_k$  is a model parameter set equal to 0.4, and  $l_k$  is a length scale. In these models, a prognostic equation for the TKE is then solved as a function of the temperature and velocity fields [Martilli et al., 2002], so coupled equations for the air velocity components have also to be computed. This approach adds excessive complexity and computational cost to this particular application, in which the uncertainties associated with urban climate prediction limit the reachable accuracy level. **A** simpler approach, proposed **by** Hong et al. **[2006],** calculates *Kd* based on correlations as a function of a mixedlayer velocity scale and the planetary boundary layer height, which has to be calculated iteratively.

The VDM proposes an alternative and robust solution, which combines the two approaches mentioned above. The diffusion coefficient is calculated **by Eq.** *5.7* and the TKE at each vertical level is approximated **by:**

$$
E = max(w_s^2, E_{min}), \qquad (5.8)
$$

where  $w_s$  is the mixed-layer velocity scale and  $E_{min}$  is set equal to 0.01 m<sup>2</sup> s<sup>-2</sup>. Atmospheric models usually establish a minimum TKE given the difficulties of predicting very stable boundary layers [Bravo et al., **2008]. A** comprehensive description of the VDM is presented in appendix **C.**

## **5.3 Model evaluation**

## **5.3.1 Comparison with mesoscale atmospheric simulations**

This section presents a separate evaluation of the VDM and the **UBL** model through a comparison with idealized three-dimensional simulations carried out **by J.** Hidalgo from the **CNRM-GAME** (France) with the **MESO-NH** atmospheric model. The horizontal domain is **80** km x **80** km with a circular city in the middle  $(D = 10 \text{ km})$ . The effects of the perturbations created by the city in the mean flow typically have a horizontal extent two to three times the size of the city [Hidalgo et al., **2008],** so the horizontal domain was large enough to prevent interferences from the cyclic boundary conditions. The horizontal grid resolution was set to **500** m. The vertical coordinate was composed of **56** levels over a vertical domain of 4 km. Vertical resolution varies from 4 m near the surface to *250* m on the top of the domain. The subgrid turbulence was parameterized following the scheme of Cuxart et al. [2000] and the mixing length of Bougeault and Lacarrere **[1989].**

Figure *5.3* represents the diurnal cycles of urban and rural surface heat fluxes imposed in the simulations. The integral of the difference between urban and rural sensible heat fluxes during one day of simulation ( $\Sigma H$ ), the capping inversion height ( $z_{inv}$ ), and the zonal wind force ( $u_{ref}$ ) were used as external forcing parameters (the capping inversion height is the same as the boundary layer height at daytime). **A** set of these three parameters was chosen and fixed for each simulation. Simulations are carried out for  $\Sigma H = \{1350 \text{ W h m}^{-2} \text{ and } 650 \text{ W h m}^{-2} \},$   $z_{inv} = \{1000 \text{ m and } 1500 \text{ m} \},$  and  $u_{ref} = \{0 \text{ m s}^{-1}, 4 \text{ m s}^{-1},$ and 8 m s<sup>-1</sup>}. The roughness length was set to  $z_{0r} = 0.01$  m for rural surfaces and  $z_{0u} = 1.0$  m for urban surfaces. The meteorological context was an idealized anticyclonic summer situation representative of Southern France.



Figure *5.3* **-** Diurnal cycles of rural and urban sensible heat flux imposed in the mesoscale simulations for the cases of aggregated urban-rural difference  $\Sigma H = \{ 1350 \text{ W h m}^{-2} \text{ (urb1) and } 650 \text{ W h m}^{-2} \text{ (urb2)} \}.$  The model considers daytime when  $H_{urb}$  reaches 80 W m<sup>-2</sup> in the morning and nighttime when  $H_{urb}$  drops below 30 W m<sup>-2</sup> in the afternoon.

The simulation results used in this analysis correspond to a vertical plane passing through the city center. Rural conditions at different heights are taken as the horizontal average of the mesh points contained in a line of length *D* centered at a distance **D/2** upwind of the city edge. Urban conditions are taken as the average of the mesh points contained in a plane of width *D* centered at the city center and height  $z_i$ .

Figure *5.4* shows the contours of potential temperature above and around the idealized city at nighttime. It can be seen that the urban boundary layer presents a horizontal distribution of air temperature due to the advection effect that could be captured **by** the discretization of the UBL model at nighttime (Fig. *5.2).* Still, this feature is not tested in this comparison, and the average temperature above the city is used. It can also be noted that the effect of the city on the first atmospheric layers is almost restricted to its horizontal area. **A** rural boundary layer is formed soon after the edge of the city, affecting the region near the surface. The plume of the city may influence downstream rural areas but above the measurement height of air temperature. This means that, excluding micro-climate effects, a weather station located outside and downstream of the city would measure similar conditions as one located upstream of the city.



Figure *5.4* **-** Lower atmosphere nighttime contours of potential air temperature over a city of diameter *D* and its surroundings in the presence of a geostrophic wind  $(u_{ref} = 4 \text{ m s}^{-1})$  (left) and under urban-breeze circulation  $(u_{ref} = 0 \text{ m s}^{-1})$  (right) calculated by the mesoscale simulation for the case  $\Sigma H = 1350 \text{ W h m}^{-2}$  and  $z_{inv} = 1000$ **m.**

Figures *5.5* and **5.6** compare the vertical profiles of potential temperature at the rural site for different zonal wind forces. It can be seen that the VDM is able to reproduce the daytime and nighttime vertical distribution of potential temperature calculated **by** the mesoscale simulations. Some differences appear in the night-day transition period, due to the different turbulence models used **by** the VDM and the Meso-NH model. The capacity of the VDM to predict  $\theta([z_i]_{ni}$  and  $\theta([z_{ref}]_{day})$ , which are the parameters required by the UBL model, is evaluated in Table 5.2. The root-mean-square error (RMSE) of  $\theta([z_i]_{night})$ between the VDM and the mesoscale simulations ranges between **0.6** and **0.9** K, which is lower than the expected error of the UBL model ( $\sim 1$  K). The RMSE of  $\theta([z_{ref}]_{day})$  ranges between 0.5 and 0.9 K. In this case, the mean-bias error (MBE) is always positive indicating a systematic overprediction of this temperature as compared to the mesoscale simulations. This can be explained **by** the fact that the VDM does not account for the longwave radiation exchange between the air and the upper atmosphere.



Figure *5.5* **-** Vertical profiles of potential temperature at daytime (left) and at nighttime (right) calculated **by** the VDM and by the mesoscale simulations for the case  $\Sigma H = 1350$  W h m<sup>-2</sup>,  $z_{inv} = 1000$  m, and  $u_{ref} = 0$  m s<sup>-1</sup>.



**Figure 5.6 -** Vertical profiles of potential temperature at daytime (left) and at nighttime (right) calculated **by** the VDM and by the mesoscale simulations for the case  $\Sigma H = 650$  W h m<sup>-2</sup>,  $z_{inv} = 1500$  m, and  $u_{ref} = 4$  m s<sup>-1</sup>.

**Table** *5.2* **-** Root-mean-square error (RMSE) and mean-bias error (MBE) between the potential temperature calculated by the VDM and by the mesoscale simulation at  $[z_i]_{night}$  and  $[z_{ref}]_{day}$  for different zonal wind forces  $(u_{ref})$ , aggregated surface heat fluxes  $(\Sigma H)$ , and capping inversion heights  $(z_{inv})$ .

Mesoscale cases		$z_{inv} = 1000 \text{ m}$ $\Sigma H = 1350 \text{ W h m}^{-2}$		$z_{inv} = 1500 \text{ m}$ $\Sigma H = 650 \text{ W h m}^{-2}$	
	$u_{ref}$ (m s <sup>-1</sup> )	RMSE(K)	MBE(K)	RMSE(K)	MBE(K)
$[z_i]_{night}$					
	$\Omega$	0.6	0.0	0.6	0.5
	4	0.8	0.3	0.6	$-0.3$
	8	0.9	0.2	0.8	$-0.4$
$[z_{ref}]_{day}$					
	$\Omega$	0.9	0.3	0.5	0.3
	4	0.7	0.5	0.5	0.4
	8	0.7	0.6	0.6	0.6

The input parameters used **by** the **UBL** model for the comparison with mesoscale simulations are detailed in Table 5.3. The model requires rural air temperatures at three different heights  $\{\theta(z_r), \theta([z_i]_{night}),\}$  $\theta$ ( $[z_{ref}]_{day}$ ), which are provided by the mesoscale simulation results at the rural site (for the purpose of this comparison since they are normally provided **by** the VDM). The same diurnal cycles of surface heat fluxes imposed to the mesoscale simulations are used in the **UBL** model (Fig. *5.3).*

Figures *5.7* and *5.8* compare the average potential temperatures of the urban boundary layer calculated **by** the **UBL** model with the average urban and rural boundary-layer temperatures calculated **by** the mesoscale simulation for different situations in terms of capping inversion height, surface heat flux and zonal wind force. Differences in air temperature, computed as RMSE and MBE between the model and the mesoscale simulations, are presented in Table *5.4.* The RMSE ranges between **0.9** and **1.3** K, where the daily-maximum urban-rural temperature difference calculated **by** the mesoscale model ranges between **1.8** and *2.5* K. This error is acceptable given the important uncertainties associated with urban climate predictions. The MBE is generally low indicating that there are no systematic errors in the model. Note that the **UHI** effect calculated with the mesoscale model does not make use of the near-surface air temperature, which would come from an **UC-BEM.**

Figures *5.7* and *5.8* show that the difference in daytime urban sensible heat flux (Fig. *5.3)* produces

**Table** *5.3* **-** Modeling inputs used in the comparison of the **UBL** model with mesoscale simulations. Other inputs of the model are rural air temperatures at three different heights  $\{\theta(z_r), \theta([z_i]_{nighl}), \theta(z_{ref})\}$  and the wind speed at *zm* calculated **by** the mesoscale simulation. The same diurnal cycles of rural and urban surface heat fluxes are imposed on the **UBL** model and to the mesoscale simulations.

Parameter	Settings
Simulation time-step	$\delta = 300$ s
Characteristic length of the city	$D, W = 10000$ m
Perimeter of the city	$P_{city} = 4D$
Horizontal area of the city	$A_{city} = D^2$
Horizontal discretization for scenario night-forced	$dx = D/4$
Nighttime boundary-layer height	$[zi]_{night} - zr = 30$ m
Daytime boundary-layer height	$[z_i]_{day} = 1000 \text{ m}$
Reference height	$[z_{ref}]_{day} = 200$ m
Rural roughness length	$z_{0r} = 0.01$ m
Circulation velocity coefficient	$k_w = 1.2$

a relatively constant change in the air temperature of the urban boundary layer during the day. The wind speed does not have significant impact on the average urban boundary-layer temperature, a feature that is captured **by** both the mesoscale model and the **UBL** model.



**Figure 5.7 -** Diurnal cycle of the average potential temperature over the urban boundary layer calculated **by** the UBL model and by the mesoscale simulation for the case  $\Sigma H = 1350 \text{ W h m}^{-2}$ ,  $z_{inv} = 1000 \text{ m}$ , and  $u_{ref} = \{4 \text{ m}$  $s^{-1}$  (left), 0 m  $s^{-1}$  (right) }. The diurnal cycle of the average potential temperature over the rural boundary layer calculated **by** the mesoscale simulation is also represented (rur).

**Table** *5.4* **-** Root-mean-square error (RMSE) and mean-bias error (MBE) between the average potential temperature of the urban boundary layer calculated **by** the **UBL** model and **by** the mesoscale simulation for different aggregated surface heat fluxes ( $\Sigma H$ ), capping inversion heights ( $z_{inv}$ ), and zonal wind forces ( $u_{ref}$ ). Errors are compared to the daily-maximum urban-rural temperature difference calculated by the mesoscale simulation *(UHI<sub>max</sub>)*.

Mesoscale cases	$z_{inv} = 1000 \text{ m}$ $\Sigma H = 1350 \text{ W h m}^{-2}$			$z_{inv} = 1500 \text{ m}$ $\Sigma H = 650 \text{ W h m}^{-2}$		
$u_{ref}$ (m s <sup>-1</sup> )	RMSE(K)	MBE(K)	$UHI_{max}$ (K)	RMSE(K)	MBE(K)	$UHI_{max}$ (K)
	0.9	0.1	2.4		$-0.1$	
	0.9	$-0.2$	2.5	1.2	$-0.4$	2.0
	0 Q	$-0.1$		1.0	$-0.3$	1.8



Figure *5.8* **-** Diurnal cycle of the average potential temperature over the urban boundary layer calculated **by** the UBL model and by the mesoscale simulation for the case  $\Sigma H = 650 \text{ W h m}^{-2}$ ,  $z_{inv} = 1500 \text{ m}$ , and  $u_{ref} = \{4 \text{ m}$  $s^{-1}$  (left), 0 m s<sup>-1</sup> (right) }. The diurnal cycle of the average potential temperature over the rural boundary layer calculated **by** the mesoscale simulation is also represented (rur).

#### **5.3.2 Comparison with field data from Basel, Switzerland, and Toulouse, France**

In this section, the VDM-UBL scheme is compared with field data from two boundary-layer experiments: the intensive observational period (IOP) of the BUBBLE experimental campaign, carried out in Basel (Switzerland) between June **10** and July **10,** 2002 [Rotach et al., **2005];** and the **CAPITOUL** experimental campaign carried out in Toulouse (France) from February 2004 to March **2005** [Masson et al., **2008].** The climate information of both sites is characterized in Table *5.5.*





In both experiments, weather data is measured simultaneously at rural and urban sites from both in-canopy and above-canopy stations (Fig. **5.9).** The evaluation of the VDM-UBL scheme consists of introducing 2-m rural weather data as inputs in the model and comparing the calculated and observed forcing air temperatures above the urban canopy layer.

In addition, during the CAPITOUL experiment, radiosondes (Vaisala RS92) were launched from various rural and urban locations. As the balloons ascended, meteorological data were recorded each second. This led to a vertical resolution of approximately **5** m. In this analysis, the measurements from radiosondes launched at a rural site **17** km Northwest from Toulouse are compared to the VDM.

From the network of weather stations of the **CAPITOUL** experiment (Fig. **6.5),** the station located

at Mondouzil is assumed to be representative of rural conditions, and the station located next to the Monoprix building in the dense urban center of Toulouse is selected as representative of urban conditions.

The main urban experimental site in BUBBLE is Basel-Sperrstrasse. The site represents a heavily built-up part of the city center of Basel, mainly composed of residential buildings. The Grenzach weather station, inside the valley of the Rhine River, is used as the reference rural station.

Modeling input parameters are detailed in Table **5.6.** City characteristic lengths of *7.5* km and **5** km for Toulouse and Basel, respectively, are estimated based on aerial views of the cities. Rural and urban sensible heat fluxes are obtained from the Rural Station Model (RSM) and the **UC-BEM** presented in chapter **6.** Similar results are obtained **by** using the measurements of sensible heat fluxes from each experiment. **A** comparison of observed and calculated sensible heat fluxes is presented in section 6.3.4.





Figure *5.9* **-** Images of the weather stations of Sperrstrasse (top-left) and Grenzach (top-middle) in Basel, Switzerland, and of the weather stations of Monoprix (top-right) and Mondouzil (bottom) in Toulouse, France.

Vertical profiles of potential temperature obtained with the VDM are compared with measurements from the radiosondes. Fig. **5.10** compares calculated and measured vertical profiles for a day in winter and a day in summer, respectively. Given the simplicity of the VDM, the results show a reasonably good agreement with observations. The vertical shape of the profiles is reasonably well captured **by** the model, although the temperature values at the weather station, which are used as boundary conditions **by** the VDM, were not measured at the same location as where the radiosondes were launched.

The capacity of the VDM-UBL scheme to predict forcing air temperatures above the urban canopy layer is evaluated. Calculated monthly-average diurnal cycles are compared with observations at the urban site for summer, fall, and winter in **CAPITOUL** (Fig. **5.11)** and for summer in BUBBLE (Fig. **5.12).** Air temperature measurements at 2 m at the rural site are also represented. As can be seen, the VDM-UBL scheme is able to capture both the **UHI** effect observed at night and the Urban Cool **Table** *5.6* **-** Modeling inputs used in the comparison of the VDM-UBL scheme with field data from the experiments CAPITOUL and BUBBLE. The scheme also requires  $\theta(z_r)$  and  $u(z_m)$  from measurements at the rural site.  $\theta([z_i]_{ni}$  and  $\theta(z_{ref}))$  are provided by the VDM to the UBL model. Rural and urban sensible heat fluxes are obtained from the RSM and the **UC-BEM** presented in chapter **6.**





Figure **5.10 -** Vertical profiles of potential temperature calculated **by** the VDM and observed during the **CAPI-TOUL** experiment on March 2, **2005** *(left),* and on July 4, 2004 (right).

Island **(UCI)** effect observed in the morning. Here, the UHI and **UCI** effects are defined as the difference between the forcing air temperatures above the urban canopy layer and the rural air temperature measured at 2 m.



**Figure 5.11 -** Monthly-average diurnal cycle of forcing air temperatures above the urban canopy layer calculated **by** the VDM-UBL scheme and observed during the **CAPITOUL** experiment for July (top) and October (middle), 2004, and January (bottom), **2005,** in the dense urban area of Toulouse. Monthly-average diurnal cycles of measured rural air temperatures (rur) for the same period are also represented.

Statistical results of this comparison are presented in Table *5.7.* The RMSE between the model and observations ranges between **0.9** K and 1.2 K for both experiments, where the average daily-maximum UHI effect is 4.4 K in BUBBLE, *2.5* K in summer in **CAPITOUL,** and about **1.3** K in fall and winter in CAPITOUL. The MBE is small in all cases, which indicates that there are no systematic errors in the model.

A sensitivity analysis of the model indicates that values of  $[z_i]_{night}$  between 30 m and 100 m have an impact of  $\pm 0.1$  K on the results. No significant variations are obtained for  $[z_i]_{day}$  between 800 m and 2000 m. Chapter **6** extends the sensitivity analysis to other parameters of the model.



**Figure 5.12 -** Monthly-average diurnal cycle of forcing air temperatures above the urban canopy layer calculated **by** the VDM-UBL scheme and observed during the BUBBLE experiment between June **10** and July **10,** 2002. Monthly-average diurnal cycle of measured rural air temperature (rur) for the same period is also represented.

**Table 5.7 -** Root-mean-square error (RMSE) and mean-bias error (MBE) between the forcing air temperatures above the urban canopy layer calculated **by** the **UWG** and observed during BUBBLE experiment between June **10** and July **10,** 2002; and between the urban air temperatures calculated **by** the UWG and observed during **CAPI-**TOUL experiment in July and October, 2004, and January, **2005.** Errors are compared with the average dailymaximum **UHI** effect *(UHImax)* observed during each period, defining the **UHI** effect as the difference between the forcing air temperatures above the urban canopy layer and the rural air temperature measured at 2 m.



# **Chapter 6**

# **The Urban Weather Generator**

## **6.1 Overview**

This chapter combines models previously presented in this thesis to propose an integrated Urban Weather Generator **(UWG)** that calculates urban air temperature and humidity using meteorological information measured at an operational weather station located in an open area outside the city.

The **UWG** is a computationally efficient model based on energy conservation principles. It can be integrated into existing programs in order to account for site-specific urban weather files in building energy simulations. It can also be converted into a fully-operative program to predict building energy consumption at urban scale and the **UHI** effect, taking into account the energy interactions between buildings and the urban climate.

This chapter first describes the physics behind the **UWG.** Then, the model is evaluated against field data from the experiment BUBBLE (Basel, Switzerland) and the experiment **CAPITOUL** (Toulouse, France).

## **6.2 Model description**

The **UWG** calculates hourly values of urban air temperature and humidity given the weather data measured at an operational weather station located outside a city. The model is composed of four coupled modules (Fig. **6.1):** the Rural Station Model (RSM), which calculates sensible heat fluxes at the weather station; the Vertical Diffusion Model (VDM), which calculates vertical profiles of air temperature above the rural site; the Urban Boundary-Layer **(UBL)** model, which calculates air temperatures above the urban canopy layer (above urban canyons); and the Urban Canopy and Building Energy Model **(UC-BEM),** which calculates urban sensible heat fluxes and urban canyon air temperature and humidity. The interrelations between modules are illustrated in Fig. **6.2.** The atmospheric component of the **UWG,** composed of the VDM and **UBL** model, is described in detail in chapter **5.** This chapter describes the RSM and the **UC-BEM.**



**Figure 6.1** – Diagram of the Urban Weather Generator (UWG) scheme, which is composed of four modules: the Rural Station Model (RSM), the Vertical Diffusion Model (VDM), the Urban Boundary-Layer **(UBL)** model and the Urban Canopy and Building Energy Model **(UC-BEM).** Thermal networks indicate the main heat transfer processes included in the RSM and **UC-BEM.** *Trur,* **Tub;** and *Turb* represent the air temperature measured at the weather station, calculated at the urban boundary layer, and calculated at the urban site. The RSM provides rural sensible heat fluxes *(Hrur)* to the VDM and the **UBL** model. The **UC-BEM** provides urban sensible heat fluxes  $(H_{urb})$  to the UBL model.



**Figure 6.2 -** Information exchanged among the different modules of the UWG.

#### **6.2.1 Rural Station Model**

The RSM is a rural canopy model that reads hourly values of meteorological fields measured at the rural site and calculates sensible heat fluxes, which are then provided to the VDM and the **UBL** model.

The model is based on an energy balance at the soil surface. **A** transient heat diffusion equation represents the storage and release of heat from the ground. Dividing the soil in discrete layers, the RSM solves the following system of equations:

$$
d_1(\rho c)_1 \frac{\partial T_1}{\partial t} = C_{1,2}(T_2 - T_1) + Q_{surf}
$$
 (6.1)

for the first layer,

$$
d_i(\rho c)_i \frac{\partial T_i}{\partial t} = C_{i,i+1}(T_{i+1} - T_i) + C_{i,i-1}(T_{i-1} - T_i)
$$
(6.2)

for each intermediate layer, and

$$
d_{n-1}(\rho c)_{n-1} \frac{\partial T_{n-1}}{\partial t} = C_{n-i,n} (T_{deep} - T_{n-1})
$$
\n(6.3)

for the deepest layer. In Eqs. [6.1-6.3],  $d_i$ ,  $(\rho c)_i$ , and  $T_i$  represent the depth, the volumetric heat capacity [J m<sup>-3</sup> K<sup>-1</sup>], and the average temperature of the layer *i*, respectively;  $C_{i,j}$  is the mean thermal conductance over the distance between two layers  $[W \, m^{-2} \, K^{-1}]; \, Q_{surf}$  is the sum of net-radiation, sensible, and latent heat fluxes at the surface; and  $T_{deep}$  is the annual-average air temperature of the site, used as boundary condition deep into the ground.

Surface sensible heat fluxes are computed **by** using convective heat transfer coefficients **(CHTC)** (see next section). Latent heat fluxes due to the evapotranspiration of vegetation (if present) are calculated as a fraction of the absorbed shortwave radiation. More sophisticated vegetation models, usually applied to numerical atmospheric models, can be found in the literature [Noilhan and Mahfouf, **1996].** However, they contain various empirical parameters for which it is difficult to find values if detailed information about the soil and plant composition is not available.

**A** suitable model for the accuracy requirements of the **UWG** takes advantage of the fact that the ratio between the latent heat flux and the net radiation is relatively constant during daytime. The net radiation is the sum of the net shortwave radiation (that which is absorbed) and the net longwave radiation, which typically presents small variations during the day. In the absence of light, plants' stomata are usually closed so that transpiration after sunset is virtually negligible. Roth **[2007]** shows this effect **by** comparing heat fluxes measured in different cities with different vegetation fractions. Other studies also indicate that the evapotranspiration from vegetation is mainly dependent on solar radiation [Shashua-Bar and Hoffman, 2002]. The difficulty is then to determine the fraction of absorbed solar radiation that is converted into latent heat **by** plants. As a first approximation, the current version of the model assumes *50%* conversion.

#### **6.2.2 Urban Canopy and Building Energy Model**

Based on previous UC-BEMs (chapters **3** and 4), the **UC-BEM** of the **UWG** calculates urban canyon air temperature and humidity from radiation and precipitation data, air velocity and humidity measured at the weather station, and air temperature above the urban canopy layer calculated **by** the **UBL** model.

The **UC-BEM** assumes that the air inside the urban canopy layer is well mixed. Urban canyon air temperatures are obtained **by** the heat balance method, taking into account the heat capacity of the urban canyon air (Fig. **6.1).** The urban canyon energy balance accounts for the heat fluxes from walls, windows and the road, the sensible heat exchange between the canyon air and the atmosphere, the heat fluxes due to exfiltration, the waste heat from **HVAC** equipment and other anthropogenic heat sources, and the radiant heat exchange between the canyon air and the sky. Thus, the urban canyon energy balance is given **by:**

$$
V_{can}\rho c_v \frac{dT_{urb}}{dt} = A_w h_w (T_w - T_{urb}) +
$$
  
\n
$$
A_r h_r (T_r - T_{urb}) + A_r h_{rd,sky} (T_{sky} - T_{urb})
$$
  
\n
$$
A_{win} U_{win} (T_{in} - T_{urb}) + V_{inf/vent} \rho c_p (T_{in} - T_{urb}) +
$$
  
\n
$$
u_{ex}\rho c_p (T_{ubl} - T_{urb}) + H_{waste} + H_{traffic},
$$
\n(6.4)

where  $T_{urb}$ ,  $T_{in}$  and  $T_{ub}$  are the air temperature of the urban canyon, the indoor air temperature, and the air temperature of the urban boundary layer above the urban canyon, respectively;  $T_w$  and  $T_r$  are the surface temperatures of walls and road, respectively;  $T_{sky}$  is the effective sky temperature;  $V_{can}$  is the volume of the urban canyon air; *Uwin* is the U-factor of windows including heat exchange coefficients at both sides;  $\dot{V}_{inf/vent}$  is the exfiltration airflow rate;  $H_{waste}$  is the sensible component of waste heat flux released **by HVAC** systems into the urban canyon; *Htraffic* represents other anthropogenic sources of heat; and  $u_{ex}$  is the exchange velocity between the in-canopy and above-canopy flows. An analogous latent heat balance is solved to calculate the humidity content of the urban canyon air **by** computing the latent heat fluxes from the atmosphere, buildings and road. The **UWG** assumes that the air humidity above urban canyons is the same as the one measured at the weather station for each time step.

The exchange velocity  $(u_{ex})$  is obtained from an expression extracted from Bentham and Britter **[2003]:**

$$
u_{ex} = \frac{u_{\ast}}{\frac{u_{atm}}{u_{\ast}} - \left(\frac{8}{V_{H_{urb}}}\right)^{1/2}},
$$
(6.5)

where  $u_*$  is the friction velocity (see appendix C) and  $u_{atm}$  is a reference air velocity above the urban canopy assumed equal to the air velocity measured at the weather station.

In large spaces such as urban canyons, the water vapor present in the air participates in the radiant heat exchange. The air emissivity is calculated as a function of the humidity content and the size of the space [Siegel and Howell, 1981]. In Eq. 6.4,  $h_w$  and  $h_r$  are the heat transfer coefficients of walls and road, respectively, which combine convective and radiative effects  $(h = h_{cv} + h_{rd})$ ; and  $h_{rd,skv}$  is the radiant heat transfer coefficient between the urban canyon air and the sky (see appendix **D).**

External surface temperatures of walls, road, and roof are calculated **by** solving a similar surface energy balance to the one described for the rural soil (Eqs. **[6.1-6.3]).** The boundary conditions for the road are the same as for the rural soil. In the case of walls and roof, the indoor boundary condition is a heat flux calculated **by** the building energy model.

The outdoor surface heat flux is composed of shortwave radiation, longwave radiation, sensible and latent heat components. The solar radiation received **by** walls and road is calculated **by** assuming an average urban canyon orientation (see appendix **D).** The longwave radiation among walls, road, urban canyon air, and the sky is computed **by** linearization of the Stefan-Boltzmann equation accounting for the transmittance of the urban canyon air and assuming only one bounce of radiative heat fluxes between surfaces (see appendix **D).** In terms of longwave radiation, window surfaces are assumed to have the same temperature as wall surfaces. Surface sensible heat fluxes are computed **by** using **CHTC,** which are calculated as a function of the air velocity above the urban canopy layer  $(u_{\text{atm}})$  by using a correlation extracted from Palyvos **[2008]:**

$$
h_{cv} = 5.8 + 3.7u_{atm}.\tag{6.6}
$$

The air velocity inside the urban canyon  $(u_{can})$  is used in Eq. 6.6 for the road. This is given by the following equation [Bentham and Britter, **2003]:**

$$
u_{can} = u_* \left(\frac{8}{V H_{urb}}\right)^{1/2}.\tag{6.7}
$$

Urban sensible heat fluxes (required **by** the **UBL** model) are calculated as the sum of the heat exchange between the canyon air and the atmosphere and the convective heat flux from building roofs, including the fraction of waste heat emissions from outdoor **HVAC** equipment located there.

For horizontal surfaces (road and roof), the **UC-BEM** calculates the latent heat flux associated with a thin layer of water (max 1 mm) which remains after the precipitation water is run off. The mass balance to the film of water is given **by:**

$$
\frac{dw_g}{dt} = (P_g - E_g),\tag{6.8}
$$

where  $P_g$  and  $E_g$  are the precipitation and evaporation mass fluxes, respectively [m s<sup>-1</sup>]. The water evaporation is calculated as:

$$
E_g = \frac{1}{\rho_w R} (q_{sat}(T_{surf}) - q_a), \qquad (6.9)
$$

where *R* is an aerodynamic resistance [s  $m^{-1}$ ] obtained from the CHTC (Eq. 6.6),  $\rho_w$  is the water density,  $q_{sat}$  is the saturation specific humidity [kg kg<sup>-1</sup>] at surface temperature, and  $q_a$  is the specific humidity of the air above the surface. Whenever the depth of the layer of water is greater than zero, the latent heat flux is calculated as  $LE = E_g \rho_w l_v$ , where  $l_v$  is the latent heat of vaporization [J kg<sup>-1</sup>].

The vegetation model of the **UC-BEM** follows the shade-convection approach [Shashua-Bar and Hoffman, 2002]. The solar radiation that reaches urban canyons is partially blocked **by** the tree canopy according to the horizontal vegetation density of the site. The solar radiation absorbed **by** the trees is split into sensible and latent heat fluxes as indicated in section **6.2.1.** These fluxes then participate in the energy balance of the urban canyon. Although the tree canopy reduces the sky view factor of the urban canyon and consequently may reduce the net outgoing longwave radiation, the model assumes that the temperature of urban surfaces is close enough to the one of the tree canopy so that the overall effect of trees on the longwave radiation balance is negligible.

The building energy model is based on the one developed in chapter **3.** The physical and geometric definition of buildings is kept as simple as possible, while maintaining the required features of a comprehensive building energy model. The model considers a single thermal zone, where the thermal inertia of building materials associated with multiple levels is represented **by** a generic thermal mass. The model accounts for heat gains due to transmitted solar radiation, heat conduction through the enclosure, infiltration, ventilation, and internal heat gains, as well as for the dynamical evolution of indoor air temperature (between thermal set points) and humidity.

To calculate cooling energy consumption, the model solves the dehumidification of the air passing through the cooling system **by** assuming that the air leaves the cooling coil at **90%** relative humidity. The model includes the mixture of recirculated air and outdoor air according to the ventilation air flowrate.

Waste heat fluxes are calculated as a function of the building energy consumption  $(Q_{HVAC})$  and building energy demand  $(Q_{dem})$ . For example, for a cooling system the waste heat flux is given by:

$$
Q_{waste} = Q_{HVAC} + Q_{dem}.\tag{6.10}
$$

## **6.3 Model evaluation**

The **UWG** scheme is compared with field data from two boundary-layer experiments: the intensive observational period (IOP) of the BUBBLE experimental campaign, carried out in Basel (Switzerland) between June **10** and July **10,** 2002 [Rotach et al., *2005];* and the **CAPITOUL** experimental campaign carried out in Toulouse (France) from February 2004 to March **2005** [Masson et al., **2008].** The climate information of both sites is characterized in Table *5.5.*

Chapter **5** compares calculated and observed air temperatures above the urban canopy layer for these two case studies. This chapter evaluates the **UWG by** comparing calculated and observed urban canyon air temperatures.

The system parameters of the **UWG** used in this comparison are summarized in Table **6.1.** The parameters of the VDM-UBL scheme are the daytime and nighttime boundary layer heights  $(z<sub>i</sub>)$ , the reference height  $(z_{ref})$ , and the urban-breeze scaling coefficient  $(k_w)$  (see chapter 5). In addition, the sensible-latent heat split of vegetation is assumed to be *0.5* and the vegetation albedo is taken as *0.25,* which is the average value reported in the experiments. Finally, the model accounts for the effect of vegetation from May to November (deciduous vegetation).



**Table 6.1 -** System parameters of the **UWG** used in the model comparison with field data from Basel, Switzerland, and Toulouse, France.

#### **6.3.1 Comparison with field data from Basel, Switzerland**

The main urban experimental site in BUBBLE is Basel-Sperrstrasse. The site represents a heavily builtup part of the city center of Basel, mainly composed of residential buildings. Table **6.2** shows the inputs parameters used in the evaluation of the **UWG,** based on a characterization of the urban site carried out **by** Hamdi and Masson **[2008]. A** sensitivity analysis of input parameters is presented in section **6.3.3.**

The Grenzach weather station, inside the valley of the Rhine River, is used as the reference rural station.

Figure **6.3** compares hourly values of urban air temperatures calculated **by** the **UWG** with the air temperatures measured at the urban and rural sites for a week in June. The monthly-average diurnal cycle for the IOP of the BUBBLE campaign is represented in Fig. 6.4. As can be seen, the **UWG** is able to capture both the **UHI** effect observed at night and the Urban Cool Island **(UCI)** effect observed during the day, although it overpredicts the later partly due to the simplifying assumptions of the vegetation model.

Statistical results of this comparison are presented in Table **6.3.** The root-mean-square error (RMSE) between the model and observations is **1.1** K, where the average daily-maximum **UHI** effect is **5.2** K. Errors of about **I** K are acceptable given the important uncertainties associated with urban climate predictions (see next section). The mean-bias error (MBE) is *-0.5* K, which reproduces the overprediction of the **UCI** effect observed in Fig. **6.3.**

**Table 6.2 -** Inputs of the **UWG** used in the model comparison with field data from Basel, Switzerland, and Toulouse, France. Both parametrizations represent densely populated residential areas and rural areas covered **by** grass. The thermal properties of construction materials are indicated in Table 2.2.





÷,

**Figure** *6.3* **-** Hourly values of urban canyon air temperature calculated **by** the **UWG** and observed during the BUBBLE experiment between June 21 and June **28,** 2002. Hourly values of measured rural air temperature (rur) for the same period are also represented.



**Figure 6.4 -** Monthly-average diurnal cycle of urban canyon air temperature calculated **by** the **UWG** and observed during the BUBBLE experiment between June **10** and July **10,** 2002. Monthly-average diurnal cycle of measured rural air temperature (rur) for the same period is also represented.

## **6.3.2 Comparison with field data from Toulouse, France**

The **CAPITOUL** campaign is an extensive boundary-layer experiment, which includes (among other types of measurements) a network of weather stations inside and at the periphery of Toulouse (Fig. **6.5).** In this analysis, the station located at the central location of the city, next to the Monoprix building **(MNP),** is selected as representative of urban conditions. Five of the surrounding urban stations are also included in the analysis **(MIC, CIT,** MIN, **ILE,** and CYP) to show the variability of air temperatures within the same urban area. The characterization of the site is presented in section 2.4.2. Similar input parameters are used here (Table **6.2).** The reference weather station is located at Mondouzil **(MON),** an agricultural rural area at the North-East periphery of the city.

Figure **6.6** compares hourly values of urban air temperatures calculated **by** the **UWG** with the air temperatures measured at the urban and rural sites for a week in July. The monthly-average diurnal cycles for July and October, 2004, and January, **2005,** are represented in Fig. **6.7.** The error bar represents the root-mean-square difference between the air temperatures observed in the five urban stations surrounding the **MNP** station and the air temperature measured at the **MNP** station (Fig. **6.5).** The results show the capacity of the **UWG** to reproduce the **UHI** effect for different seasons. The observed variability of air temperature around the **MNP** weather station is about **I** K. This justifies the statement that the error associated with UWG's predictions is acceptable and within the air temperature range observed in different locations of the same urban area.

Statistical results of this comparison are presented in Table **6.3** for the three months. The RMSE between the model and observations ranges between **0.8** K and 1.2 K, where the average daily-maximum **UHI** effect ranges between 2.4 K and **3.6** K. The MBE is generally low, which indicates that there are no systematic errors in the model.

Observations show that the **UHI** effect at mesoscale level (due to the aggregate effects of the whole city) cannot be neglected. From the daily-maximum **UHI** effect observed inside urban canyons (e.g. **3.6** K in summer in Toulouse, Table **6.3),** more than half (e.g. **2.5** K, Table **5.7)** is due to the mesoscale effect.

Table **6.3 -** Root-mean-square error (RMSE) and mean-bias error (MBE) between the urban air temperatures calculated **by** the **UWG** and observed during BUBBLE experiment between June **10** and July **10,** 2002; and between the urban air temperatures calculated **by** the **UWG** and observed during **CAPITOUL** experiment in July and October, 2004, and January, *2005.* Errors are compared to the average daily-maximum **UHI** effect *(UHIax)* observed during each period.





Figure 6.5 – Map of the weather station network during the CAPITOUL experiment carried out in Toulouse, France, from February 2004 to March *2005.*



Figure **6.6 -** Hourly values of urban canyon air temperature calculated **by** the **UWG** and observed during the **CAPITOUL** experiment between July 21 and July **28,** 2004. Hourly values of measured rural air temperature (rur) for the same period are also represented.



**Figure 6.7 -** Monthly-average diurnal cycles of urban canyon air temperature calculated **by** the **UWG** and observed during the CAPITOUL experiment in July (top) and October (middle), 2004, and in January (bottom), *2005.* Monthly-average diurnal cycles of measured rural air temperature (rur) for the same periods are also represented. The error bar represents the root-mean-square difference between the air temperature observed in the five urban stations surrounding the **MNP** station and the air temperature measured at the **MNP** station.

#### **6.3.3** Sensitivity analysis

**A** sensitivity analysis is carried out for some of the model parameters. Table 6.4 shows the variation of the error obtained in the comparison between the UWG and observations in summer when model parameters range between *-25%* and *+25%* of the reference value indicated in Tables **6.1** and **6.2.** It can be seen that, although all parameters have an effect, the most critical ones are the morphological parameters; in particular, the horizontal building density and the vertical-to-horizontal urban area ratio. Values for these parameters are available for numerous cities around the world and can be obtained from

geographic information systems.

Another parameter that has a noticeable effect on the results is the reference height of the VDM at which the vertical profile of potential temperature is assumed uniform. The value used in this analysis gives reasonably good results and was obtained from comparison with mesoscale atmospheric simulations (chapter *5),* but further investigation might be required.

The case study of BUBBLE is sensitive to some vegetation parameters for which it is difficult to find exact values. This indicates another area for model improvement. It is also sensitive of the thermal mass of the road (it has a lower building density than the case of CAPITOUL).

Table 6.4 **-** Maximum variation of the RMSE or the MBE obtained in the comparison between the urban air temperatures calculated **by** the **UWG** and observed during the experiments in summer when model parameters range between **-25%** and *+25%* of the reference value indicated in Tables **6.1** and **6.2.** Units are K.



#### **6.3.4 Heat flux comparison**

An additional evaluation of the **UWG** (in particular, of the RSM and the **UC-BEM)** is carried out **by** comparing the sensible and latent heat fluxes leaving the rural and urban canopies. The rural and urban sensible heat fluxes are exchanged between the canopy models and the VDM-UBL scheme (Fig. **6.1).** The latent heat flux comparison allows testing the proposed vegetation model. Fig. **6.8** compares the monthly-average diurnal cycle of sensible and latent heat fluxes calculated **by** the **UWG** and observed during the BUBBLE and **CAPITOUL** experiments in summer. The sensible-latent split factor of the vegetation model (section **6.2.1)** may cause the overprediction of the latent heat flux at the rural site. The oscillation of latent heat flux at the urban site can be explained **by** the intermittent precipitation recorded for some days in summer. Still, the agreement between simulated and observed heat fluxes is acceptable for the sensitivity of the **UWG** to these variables.



**Figure 6.8 -** Monthly-average diurnal cycles of surface heat fluxes calculated **by** the **UWG** and observed during the BUBBLE and **CAPITOUL** experiments in summer. The following scenarios are represented: (top-left) Baselurban sensible, (top-right) Basel-rural sensible, (middle-top-left) Basel-urban latent, (middle-top-right) Basel-rural latent, (middle-bottom-left) Toulouse-urban sensible, (middle-bottom-right) Toulouse-rural sensible, (bottom-left) Toulouse-urban latent, (bottom-right) Toulouse-rural latent.

# **Conclusions**

# **Chapter 7**

# **Summary of contributions and future work**

This thesis presents a study of the energy interactions between buildings and the urban climate through the development and evaluation of a set of models. Chapters 2, **3** and 4 are devoted to three different urban canopy and building energy models (UC-BEMs) with different levels of detail and applications. Chapters **5** and **6** present the different components of a novel urban climate prediction tool.

# **7.1 Urban canopy and building energy models**

Chapter 2 presents a Coupled Scheme **(CS)** between a detailed building energy simulation model, EnergyPlus, and an urban canopy model, the Town Energy Balance (TEB) scheme [Masson, 2000]. The **CS** combines models that have already been extensively used and evaluated within their respective scientific communities, building engineering and urban climatology. This makes the **CS** a very useful tool to evaluate other UC-BEMs. It also allows an analysis of the effect on climate of sophisticated building and building system configurations (those included in EnergyPlus), as well as an evaluation of their sensitivity to urban climate conditions. Apart from the respective evaluations of EnergyPlus and the TEB model that can be found in the literature, this thesis presents a comparison of the **CS** with the original TEB model and field data from the urban center of Toulouse, France. This comparison verifies that the iterative coupling process between the two models is solved correctly and shows the capacity of the **CS** to predict heating energy consumption at urban scale. Chapter 2 also presents some examples of application of the **CS.** The scheme is used to evaluate the effect on the energy consumption and waste heat emissions of three different energy efficiency strategies for Toulouse: shading devices, economizers, and heat recovery.

Before this thesis, only the last two of the three most popular urban canopy models, Masson [2000], Kusaka et al. [2001], and Martilli et al. [2002], had integrated building energy models [Kikegawa et al., **2003;** Salamanca et al., 2010]. The building energy model of the TEB scheme is developed as a part of this research and is presented in chapter **3.** Its objective is to represent the building effects on urban climate and to estimate the energy consumption of buildings at city or neighborhood scale. In contrast to previous building energy models integrated in urban canopy models, BEM-TEB is developed in collaboration between the urban climatology community represented **by** the **CNRM-GAME** (France) and the building engineering community represented **by** the Building Technology Program at MIT. Furthermore, it includes specific models for active and passive building systems, which allows a performance assessment of different energy efficiency strategies in an urban context. An evaluation of the model is presented in three steps: modeling assumptions, verification, and comparison with field data. The **CS,** which already incorporates a detailed building simulation model, is used in the verification process. BEM-TEB, and the possibility of coupling it with mesoscale atmospheric simulations, allows for a multi-scale simulation platform from the atmosphere down to buildings that can be used to study the implications for urban climate and building energy consumption of future climate change scenarios. Further developments of BEM-TEB include extending the evaluation to other building configurations and climates, introducing new **HVAC** configurations, such as heat-pumps or variable-air-volume systems, and improving the current models of shadowing devices and natural ventilation systems.

Chapter 4 presents a simple and fast **UC-BEM,** the resistance-capacitance (RC) model, specifically designed to investigate the energy interactions between buildings and the urban climate. The RC model is built on a state-space formulation of the thermal network that represents the fundamental physical relations between buildings and their urban environment. This allows for faster parametric analyses and makes it possible to easily test modeling hypotheses. The RC model is evaluated against the **CS** for summer and winter conditions and for different building configurations. The model is then used in a series of parametric analyses to investigate the impact of the **UHI** effect on the energy consumption of buildings. The resulting relationship is linear. For residential buildings in summer, a *5%* increase in cooling energy demand can be expected per **I** K increase in the maximum **UHI** effect (usually at night). **A** similar order-of-magnitude decrease in heating energy demand of a residential building can be expected from an equivalent wintertime **UHI** effect. The energy demand of commercial buildings is not significantly affected **by** the **UHI** effect if they are not naturally ventilated. Although not included in the analysis carried out with the RC model, the **UHI** effect can have an impact on the energy consumption of commercial buildings through the dependence of the system efficiency on outdoor air temperatures.

Depending on the proportion of cooling and heating days of each particular climate and the type of system used to meet building energy demands, the **UHI** effect can have a positive or negative impact on the overall energy consumption of cities. The main mechanism **by** which the **UHI** effect influences the indoor energy performance is infiltration and ventilation; the impact from the conductive heat transfer through the building enclosure is relatively small. This result highlights the importance of considering the **UHI** effect in the design and analysis of building systems, such as natural ventilation or economizers, in which the outdoor air entering the building plays a critical role.

The RC model is also used to investigate the dominant mechanisms **by** which the indoor environment affects outdoor air temperatures. In wintertime, exfiltration heat fluxes can have a noticeable effect on outdoor air temperatures. Waste heat emissions from **AC** systems are the main mechanism **by** which the energy performance of buildings affects outdoor thermal conditions, the impact from heat conduction through the building enclosure again being relatively small. This analysis shows that, for building densities lower than **0.6,** the increase in outdoor air temperature is approximately proportional to the heat flux per unit of urban area released into the urban canyon with a relation of  $1 \text{ K}$  per  $100 \text{ W m}^{-2}$  for low wind speeds ( $\sim$ 2 m s<sup>-1</sup>) and 0.5 K per 100 W m<sup>-2</sup> for high wind speeds ( $\sim$ 10 m s<sup>-1</sup>). This analysis can be seen as a lower limit of the impact of waste heat on urban air temperatures because it assumes that the boundary conditions at the top of urban canyons are invariant to the changes in the canopy heat fluxes. Future work could relax this assumption **by** using the coupled effect between the urban boundary layer and the urban canopy layer captured **by** the Urban Weather Generator **(UWG).**

The UC-BEMs developed in this thesis have been evaluated with field data from urban areas in which the use of **AC** systems is negligible. The Center for Environmental Sensing and Modeling **(CENSAM)**
in Singapore is carrying out urban climate experiments that could be adapted to simultaneously record building energy consumption. Future work will consist of participating in such experiments and further evaluating the capacity of UC-BEMs to predict cooling energy consumption of urban areas and the effect of waste heat emissions on the urban climate.

#### **7.2 Urban climate prediction tool**

Chapters *5* and **6** present different components of the **UWG** scheme, a physically based and computationally fast model to predict the **UHI** effect in a city, both at mesoscale and at canopy-scale (Fig. 1.2), given meteorological information measured in an operational weather station outside the city.

The atmospheric component of the **UWG** is presented in chapter *5.* The Vertical Diffusion Model (VDM) calculates vertical profiles of potential temperature at the rural site **by** solving a one-dimensional heat diffusion equation. The diffusion coefficient is calculated dynamically as a function of a mixedlayer velocity scale for which correlations can be found in the literature. Values of potential temperature at different heights calculated **by** the VDM are used in the Urban Boundary Layer **(UBL)** model, which calculates air temperatures above the urban canopy layer **by** applying an energy balance to the urban boundary layer (or sub-divisions). The VDM-UBL scheme requires the rural and urban sensible heat fluxes calculated **by** the canopy models.

The VDM-UBL scheme has been satisfactorily evaluated against three-dimensional mesoscale atmospheric simulations and against field data from Basel, Switzerland, and Toulouse, France. The comparison shows a reasonably good agreement, given the important uncertainties associated with urban climate predictions. The **UBL** model is being incorporated into the off-line model of the **SURFEX** scheme [Martin et al., **2007]** in the context of a French project studying climate change impact on urban energy consumption **[CNRM-GAME,** 2010]. This makes it possible to carry out long-term analyses of future climate scenarios without having to run computationally expensive mesoscale simulations.

The canopy components of the **UWG** are presented in chapter **6.** The Rural Station Model (RSM) reads hourly values of meteorological fields measured at the rural site and calculates sensible heat fluxes, which are then provided to the VDM and the **UBL** model. The **UC-BEM** calculates urban canyon air temperature and humidity from radiation and precipitation data, air velocity and humidity measured at the weather station, and air temperature above the urban canopy layer calculated **by** the **UBL** model.

The **UWG** has also been compared with the data sets from Basel, Switzerland, and Toulouse, France. The expected error associated with **UWG** predictions is about 1 K, which stays within the range of air temperature variability observed in different locations of the same urban area. The comparison with field data highlights that the **UHI** effect cannot be computed only from the urban canyon effect (vertical component), but must also include the aggregate effect of the whole city (horizontal component). As a consequence, urban climate prediction tools cannot be limited to an urban canopy model, but must also consider the effect of the urban boundary layer. This can be achieved **by** using mesoscale atmospheric simulations or **by** using the simplified approach of the VDM-UBL scheme.

The comparison of the VDM-UBL scheme with field data shows a slightly better performance than that of the integrated **UWG.** This can be explained **by** the assumptions made **by** the **UC-BEM** to represent the heat exchange between the in-canopy and the above-canopy flows. The current version uses semi-empirical correlations based on exchange velocities. This method was developed to represent homogeneous rural canopies (crops, trees, etc.), and its application to urban canopies has not been formally tested. Future developments of the **UC-BEM** will improve this representation. One possible solution is the multi-layer approach developed **by** Hamdi and Masson **[2008].**

The reference weather station for the **UWG** can be situated in any location on the periphery of the city as long as it is not surrounded **by** urbanization and is not affected **by** site-specific micro-climate conditions produced **by** the orography or **by** the presence of large bodies of water. For example, a weather station near the sea would not be appropriate for applying the **UWG.** The current version of the **UWG** has performed well in European-type cities in which the urban morphology is relatively homogeneous and the urban vegetation is scarce. Further developments of the model will address the heterogeneity of urban areas and the spatial distribution of the UHI effect within a city. They will also include a better treatment of latent heat fluxes, while maintaining the approach of keeping the model as simple as possible.

The **UWG** can be integrated into existing programs in order to account for site-specific urban weather files in building energy simulations. It can also be converted into a fully-operative program to predict building energy consumption at urban scale and the **UHI** effect, taking into account the energy interactions between buildings and the urban climate.

# **Appendices**

 $\label{eq:2.1} \frac{1}{\sqrt{2}}\int_{0}^{\infty}\frac{1}{\sqrt{2\pi}}\left(\frac{1}{\sqrt{2\pi}}\right)^{2\alpha} \frac{1}{\sqrt{2\pi}}\int_{0}^{\infty}\frac{1}{\sqrt{2\pi}}\left(\frac{1}{\sqrt{2\pi}}\right)^{\alpha} \frac{1}{\sqrt{2\pi}}\frac{1}{\sqrt{2\pi}}\int_{0}^{\infty}\frac{1}{\sqrt{2\pi}}\frac{1}{\sqrt{2\pi}}\frac{1}{\sqrt{2\pi}}\frac{1}{\sqrt{2\pi}}\frac{1}{\sqrt{2\pi}}\frac{1}{\sqrt{2\pi}}$ 

## **Appendix A**

# **Nomenclature**

#### **Table A.1 -** Nomenclature.







 $\mathcal{L}^{\text{max}}_{\text{max}}$ 

 $\label{eq:2.1} \frac{1}{\sqrt{2}}\sum_{i=1}^n\frac{1}{\sqrt{2}}\sum_{i=1}^n\frac{1}{\sqrt{2}}\sum_{i=1}^n\frac{1}{\sqrt{2}}\sum_{i=1}^n\frac{1}{\sqrt{2}}\sum_{i=1}^n\frac{1}{\sqrt{2}}\sum_{i=1}^n\frac{1}{\sqrt{2}}\sum_{i=1}^n\frac{1}{\sqrt{2}}\sum_{i=1}^n\frac{1}{\sqrt{2}}\sum_{i=1}^n\frac{1}{\sqrt{2}}\sum_{i=1}^n\frac{1}{\sqrt{2}}\sum_{i=1}^n\frac$ 

**Table A.3 -** Nomenclature (continued).

 $\sim$ 



#### **Table A.4 -** Nomenclature (continued).



 $\sim$ 

 $\sim 10$ 

### **Appendix B**

## **Building Energy Model in TEB**

#### **B.1 Heat balance method**

The convection term of **Eq. (3.1)** is calculated from:

$$
Q_{\rm cv} = h_{\rm cv} (T_{\rm is} - T_{\rm in}), \qquad (B.1)
$$

where  $T_{\text{is}}$  and  $T_{\text{in}}$  are the temperature of an interior surface and of the indoor air, respectively. The convective heat transfer coefficient has the following values obtained from EnergyPlus documentation **[DOE, 2010a]:**  $h_{cv} = 3.076 \text{ W m}^{-2} \text{ K}^{-1}$  for a vertical surface;  $h_{cv} = 0.948 \text{ W m}^{-2} \text{ K}^{-1}$  for a horizontal surface with reduced convection (floor surface with  $T_{\text{is}} < T_{\text{in}}$  and ceiling surface with  $T_{\text{is}} > T_{\text{in}}$ ); and  $h_{\text{cv}} =$ 4.040 W  $\rm m^{-2}$  K<sup>-1</sup> for a horizontal surface with enhanced convection. The radiation term is calculated as:

$$
Q_{\rm rd,i-j} = h_{\rm rd} F_{i-j} (T_{\rm s,i} - T_{\rm s,j}), \tag{B.2}
$$

where  $h_{rd}$  is a radiative heat transfer coefficient and  $F_{i-j}$  is the configuration factor between surfaces i and **j.** Radiative heat transfer coefficients are calculated as:

$$
h_{\rm rd} = 4\varepsilon^2 \sigma T_{\rm rd}^3,\tag{B.3}
$$

where  $\varepsilon = 0.9$  is the surface emissivity,  $\sigma$  is the Stefan-Boltzmann constant, and  $T_{rd}$  is an average surface temperature. View factors *(F)* between surfaces are based on those developed **by** Masson [2000] for a two-dimensional urban canyon:

$$
F_{\text{fl}-\text{m}} = \left( (h/w)_{\text{fl}}^2 + 1 \right)^{1/2} - (h/w)_{\text{fl}},\tag{B.4}
$$

$$
F_{\text{fl-wi}} = (1 - F_{\text{fl-m}}) (1 - \text{GR}), \tag{B.5}
$$

 $F_{\text{fl}-\text{win}} = (1 - F_{\text{fl}-\text{m}}) \text{GR},$  (B.6)

$$
F_{\text{aux}} = \left( (h/w)_{\text{fl}} + 1 - \left( (h/w)_{\text{fl}}^2 + 1 \right)^{1/2} \right) / (h/w)_{\text{fl}},
$$
 (B.7)

$$
F_{\rm wi-m} = F_{\rm win-m} = F_{\rm aux} (2N_{\rm fl} - 2) / (2N_{\rm fl}), \tag{B.8}
$$

$$
F_{\text{wi}-\text{win}} = (1 - F_{\text{aux}}) \text{GR},\tag{B.9}
$$

$$
F_{\text{wi--fl}} = F_{\text{win--fl}} = F_{\text{aux}}/2N_{\text{fl}},\tag{B.10}
$$

$$
F_{\text{win-wi}} = (1 - F_{\text{aux}}) (1 - GR), \tag{B.11}
$$

$$
F_{\mathbf{m}-\mathbf{wi}} = F_{\mathbf{wi}-\mathbf{m}} A_{\mathbf{wi}} / A_{\mathbf{m}},\tag{B.12}
$$

$$
F_{\rm m-win} = F_{\rm win-m} A_{\rm win}/A_{\rm m},\tag{B.13}
$$

and

$$
F_{\mathbf{m}-\mathbf{fl}} = F_{\mathbf{fl}-\mathbf{m}}/A_{\mathbf{m}},\tag{B.14}
$$

where the subscripts fl, m, wi, and win represent floor, internal mass, internal wall, and window, respectively; GR is the glazing ratio of the building; and  $(h/w)$ <sub>fl</sub> represents the aspect ratio of one building level.

#### **B.2 Solar heat transmission**

Generally, the solar heat transmitted through windows depends on the angle of incidence of the sun. However, based on simulations with EnergyPlus, it can be shown that the solar transmittance is proportional to the window **SHGC** for an average-oriented canyon. The Solar Transmittance Factor **(STF)** is defined as the ratio between the average of the solar transmittances for different window orientations and the **SHGC.**

**A** series of simulations was carried out with EnergyPlus for eight different orientations of a window in intervals of 45'. Three characteristic days in Toulouse, the two solstices and an equinox, were simulated for different values of the **SHGC.** Fig. **Al** (top) represents the diurnal cycle of **STF** for windows with a **SHGC = 0.8.** Fig. **Al** (bottom) shows the dependence of the daytime **STF** on the **SHGC.** This analysis concludes that a constant STF of 0.75 $\pm$ 0.03 can be considered for an average-oriented window with a **SHGC** between **0.6** and **0.9.**

#### **B.3 Natural ventilation**

The natural ventilation module first compares indoor and outdoor air temperatures. If  $T_{in} > T_{urb} + 1$  K, the modules estimates a natural ventilation potential, **by** calculating the indoor air temperature with and without natural ventilation,  $T_{\text{open}}$  and  $T_{\text{close}}$ , respectively.

The conditions are considered favorable for natural ventilation if  $T_{\text{open}} < T_{\text{cool,target}}$ ,  $T_{\text{open}} < T_{\text{close}}$  and  $T_{\text{open}} > T_{\text{heat,target}} + 4 \text{ K.}$ 



Figure B.1 - Diurnal cycle of the solar transmittance factor of a window with a **SHGC =0.8** (top) and daytimeaverage solar transmittance factor for different **SHGC** (bottom). The solar transmittance factor is defined as the ratio between the average of the solar transmittances for different window orientations and the **SHGC.** In the first graph, three characteristic days of the year are represented, the two solstices and an equinox.

The natural ventilation air flowrate per unit width  $(\dot{V}_{nv})$  is calculated from the following equation for a single opening with bidirectional flow [Truong, 2012]:

$$
\dot{V}_{\text{nv}} = \frac{1}{3} \left[ g \frac{T_{\text{in}} - T_{\text{urb}}}{T_{\text{in}}} \right]^{1/2} \left[ h_{\text{win}} + \frac{T_{\text{in}}}{g \left( T_{\text{in}} - T_{\text{urb}} \right)} \frac{1}{2} u_{\text{ref}}^2 \Delta C_p \right]^{3/2} \tag{B.15}
$$

where  $h_{\text{win}}$  is the window height,  $\Delta C_p$  is the pressure coefficient difference between the windward and the leeward sides of the building, and *uref* is the average air velocity where the pressure coefficients are measured.

#### **B.4 Cooling system**

BEM accounts for the dependence of a cooling system on outdoor and indoor conditions, through the definition of characteristic performance curves **[DOE,** 2010a]. The total cooling capacity is calculated from the rated capacity, modified **by** the following curve:

$$
\varphi_Q = A_1 + B_1 T_{\text{wb,i}} + C_1 T_{\text{wb,i}}^2 + D_1 T_{\text{c,i}} + E_1 T_{\text{c,i}}^2 + F_1 T_{\text{wb,i}} T_{\text{c,i}}
$$
\n(B.16)

where  $T_{wb,i}$  (°C) is the wet-bulb temperature of the air entering the cooling coil and  $T_{c,i}$  (°C) is the dry-bulb outdoor air temperature for an air-cooled condenser (wet-bulb outdoor air temperature for an evaporative condenser). The actual **COP** of the system is calculated from the nominal **COP,** divided **by** the following curve:

$$
\varphi_{\text{COP}} = A_2 + B_2 T_{\text{wb,i}} + C_2 T_{\text{wb,i}}^2 + D_2 T_{\text{c,i}} + E_2 T_{\text{c,i}}^2 + F_2 T_{\text{wb,i}} T_{\text{c,i}}.
$$
\n(B.17)

The coefficients used in Eqs. B. **16** and B. **17** are the defaults used **by** EnergyPlus when a single-speed direct-expansion cooling system is defined: *A1* **= 0.942587793,** *B1* **=** 0.009543347, *C1* = **0.00068377,** *D=* **-0.011042676,** *E1* **=** 0.000005249, *F1* **= -0.00000972,** *A2* **=** 0.342414409, *B2* **= 0.034885008,**  $C_2 = -0.0006237$ ,  $D_2 = 0.004977216$ ,  $E_2 = 0.000437951$ , and  $F_2 = -0.000728028$ .

The coefficient  $f_{PLR}$  of Eq. (3.11) is given by:

$$
f_{\rm PLR} = 0.85 + 0.15 \text{PLR},\tag{B.18}
$$

where PLR is the part-load ratio, calculated as the fraction between the energy supplied and the system capacity.

#### **B.5 Autosize function**

The rated cooling capacity is calculated **by** dynamically simulating the building with predefined diurnal cycles of outdoor air temperature and incoming solar radiation. The diurnal cycle of outdoor air temperature has a maximum defined **by** the user and an amplitude of **10.7** K. The time evolution is sinusoidal according to the following equation:

$$
T_{\text{can}} = T_{\text{size,max}} - 5.35 + 5.35 \sin(2\pi (t + 57600) / 86400). \tag{B.19}
$$

The solar radiation at each time step is given **by:**

$$
S^{\downarrow} = K_{\text{sol}} D_{\text{corr}} \cos \left( Z \right), \tag{B.20}
$$

where  $K_{sol} = 1367 \text{ W m}^{-2}$ ,  $D_{corr} = 1 + 0.0334 \cos (0.01721 D_{jultan} - 0.0552)$ , and *Z* is the solar zenith angle; and where  $D_{\text{iulian}}$  is the Julian day of the year.

## **Appendix C**

### **Vertical Diffusion Model**

The length scale *(ik)* used in **Eq.** *5.7* is determined **by** solving the following set of equations [Bougeault and Lacarrere, **1989]:**

$$
\int_{z}^{z+l_{up}} \beta(\theta(z) - \theta(z'))dz' = E(z),
$$
 (C.1)

$$
\int_{z-l_{down}}^{z} \beta(\theta(z') - \theta(z))dz' = E(z),
$$
 (C.2)

and

$$
l_k = \min(l_{up}, l_{down}), \tag{C.3}
$$

where  $l_{up}$  and  $l_{down}$  are the distances that a parcel originating from level z, and having the turbulent kinetic energy  $E(z)$ , can travel upward and downward before coming to rest due to buoyancy effects. *'down* cannot be greater than the height above the ground.

The mixed-layer velocity used in **Eq.** *5.8* is calculated according to [Hong et al., **2006]:**

$$
w_s = \left(u_*^3 + \phi_m C_{vk} w_*^3 z/z_i\right)^{1/3},\tag{C.4}
$$

where  $u_*$  is the friction velocity,  $C_{vk} = 0.4$  is the Von-Karman constant,  $\phi_m$  is a wind profile function,  $w_*$  is the convective velocity scale, and  $z_i$  is the boundary-layer height.

For unstable and neutral conditions  $(H<sub>rur</sub> > 0)$ , the wind profile function and the convective velocity scale are calculated as:

$$
\phi_m = \left(1 - 8\frac{0.1z_i}{L}\right)^{-1/3},\tag{C.5}
$$

and

$$
w_* = \left(\frac{g}{\theta(z_r)} \frac{H_{rur}}{\rho c_p} z_i\right)^{1/3}.
$$
 (C.6)

For stable conditions,  $w_* = 0$  and

$$
\phi_m = 1 + 5 \frac{0.1 z_i}{L},\tag{C.7}
$$

where *L* is the Monin-Obukhov length, calculated as:

$$
L = \frac{u_*^3 \theta(z_r)}{C_{vk}} \frac{\rho c_p}{H_{rur}}.
$$
 (C.8)

The friction velocity,  $u_*$  is calculated according to Louis [1979]:

$$
u_* = au(z_r) f_m^{1/2}, \tag{C.9}
$$

where  $a = \frac{C_{vk}}{log \pi}$  is a drag coefficient,  $u(z_r)$  is calculated from  $u(z_m)$  assuming a logarithmic profile, and  $f_m$  is a coefficient that accounts for the atmosphere stability and is given by:

$$
f_m = \frac{1}{(1 + 4.7Ri)^2},\tag{C.10}
$$

for stable and neutral conditions  $(Ri \geq 0)$  and

$$
f_m = \frac{1 - 9.4Ri}{1 + c(-Ri)^2},\tag{C.11}
$$

for unstable conditions  $Ri < 0$ . In Eq. C.11, the constant *c* is given by  $c = 69.56a^2 \left(\frac{z_r}{z_0}\right)^{1/2}$ , and the Richardson number is calculated as:

$$
Ri = \frac{gz_r(\theta(z_r) - \theta_{soil})}{\theta(z_r)u(z_r)^2}.
$$
 (C.12)

The exchange velocity used in the RC model (chapter 4) is given **by:**

$$
u_{ex} = 1.35a^2 f_m u(z_r). \tag{C.13}
$$

### **Appendix D**

### **Urban Weather Generator**

#### **D.1 Outdoor radiant heat transfer**

The radiant heat transfer coefficients (RHTC) among walls, road, and sky are given **by:**

$$
h_{rd,i-j} = 4(1 - \varepsilon_{can})\varepsilon_i\varepsilon_j \sigma F_{i-j} \overline{T_{i-j}}^3,
$$
\n(D.1)

where  $\varepsilon_{can}$  is the urban canyon air emissivity (Eq. D.3),  $\varepsilon$  is the emissivity of the surfaces i,  $j = \{$ wall, road, sky ( $\epsilon_{sky} = 1$ ) } ;  $\sigma = 5.67e^{-8}$  W m<sup>-2</sup> K<sup>-4</sup> is the Stefan-Boltzmann constant;  $F_{i-j}$  is the view factor between surfaces i and j; and  $\overline{T_{i-j}}$  is average temperature over surfaces i and j.

The RHTC between walls, road, sky and the urban canyon air are given **by:**

$$
h_{rd,can-j} = 4\varepsilon_{can}\varepsilon_j \sigma \overline{T_{can-j}}^3. \tag{D.2}
$$

The air emissivity  $(\varepsilon_{can})$  is calculated from the following expression as a function of the humidity content and the size of the space [Siegel and Howell, **1981]:**

$$
\varepsilon_{can} = 0.683 \left( 1 - exp \left( -1.17X^{1/2} \right) \right), \tag{D.3}
$$

where  $X = P_w L_e \frac{300}{T_{w0}} (P_a + bP_w)$ ; and where  $P_w$  and  $P_a$  are the partial pressures of water and air, respectively;  $L_e$  is the mean beam length calculated as the ratio between the transversal area of the urban canyon and its perimeter,  $L_e = 3.6A_{can}/P_{can}$ ; and the parameter  $b = 5 \left(\frac{300}{T_{at}}\right)^{1/2}$ *\Tu,j*

#### **D.2 Solar radiation received by walls and roofs**

This formulation has been extracted from Masson [2000] for an average urban canyon orientation. The first bounce of solar radiation is given **by** the following equations for walls and roof:

$$
K_w = K_{dir} \left( \frac{w_r}{h_{bld}} \left( 0.5 - \frac{\theta_o}{\pi} \right) + \frac{1}{\pi} tan(\lambda) (1 - cos(\theta_o)) \right) + F_w K_{dif}, \tag{D.4}
$$

$$
K_r = K_{dir} \left( \frac{2\theta_o}{\pi} + \frac{2}{\pi} \frac{h_{bld}}{w_r} tan(\lambda) (1 - cos(\theta_o)) \right) + F_r K_{dif},
$$
 (D.5)

where  $K_{dir}$  is the direct solar radiation;  $K_{diff}$  is the diffuse solar radiation;  $h_{bld}$  is the average building height; w<sub>r</sub> is the average road width,  $w_r = \frac{2h_{bld}(1-p_{bld})}{V_{H_{urb}}}$ ;  $\rho_{bld}$  is the horizontal building density;  $V_{Hurb}$  is the vertical-to-horizontal urban area ratio;  $\lambda$  is the solar zenith angle;  $\theta_o$  is the critical canyon orientation for which the road in no longer sunlit,  $\theta_o = \arcsin \left( \min \left[ \frac{w_r}{h_{bld}} \frac{1}{\tan(\lambda)}, 1 \right] \right)$ ,  $F_w$  is the wall sky view factor,  $\int$ <sup>*Pbld ran(X)*</sup>  $F_w = \frac{1}{2} \left[ \frac{h_{bld}}{w_r} + 1 - \left( \frac{(h_{bld}}{w_r})^2 + 1 \right)^{1/2} \right] / \frac{h_{bld}}{w_r}$ , and  $F_r$  is the road sky view factor,  $F_r = \left( \frac{(h_{bld}}{w_r})^2 + 1 \right)^{1/2}$ 

Solar reflections are then calculated **by:**

$$
M_w = \frac{R_w + F_w \rho_w R_r}{1 - (1 - 2F_w)\rho_w + (1 - F_r)F_w \rho_r \rho_w},
$$
(D.6)

and

$$
M_r = \frac{R_r + (1 - F_r)\rho_r(R_w + F_w \rho_w R_r)}{1 - (1 - 2F_w)\rho_w + (1 - F_r)F_w \rho_r \rho_w},
$$
(D.7)

where  $\rho_w$  and  $\rho_r$  are the wall and road surface reflectivities,  $R_w = \rho_w K_w$ , and  $R_r = \rho_r K_r$ . Then, the total solar radiation received **by** walls and road is given **by:**

$$
S_w = K_w + (1 - 2F_w)M_w + F_wM_r,
$$
 (D.8)

and

$$
S_r = K_r + (1 - F_r)M_w. \tag{D.9}
$$

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