

# Sensitivity of mesoscale model urban boundary layer meteorology to the scale of urban representation

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**Abstract.** Mesoscale modeling of the urban boundary layer requires careful parameterization of the surface due to its heterogeneous morphology. Model estimated meteorological quantities, including the surface energy budget and canopy layer variables, will respond accordingly to the scale of representation. This study examines the sensitivity of the surface energy balance, canopy layer and boundary layer meteorology to the scale of urban surface representation in a real urban area (Detroit-Windsor (USA-Canada)) during several dry, cloud-free summer periods. The model used is the Weather Research and Forecasting (WRF) model with its coupled single-layer urban canopy model. Some model verification is presented using measurements from the Border Air Quality and Meteorology Study (BAQS-Met) 2007 field campaign and additional sources. Case studies span from “neighborhood” (10 s ~ 308 m) to very coarse (120 s ~ 3.7 km) resolution. Small changes in scale can affect the classification of the surface, affecting both the local and grid-average meteorology. Results indicate high sensitivity in turbulent latent heat flux from the natural surface and sensible heat flux from the urban canopy. Small scale change is also shown to delay timing of a lake-breeze front passage and can affect the timing of local transition in static stability.

## 1 Introduction

The urban boundary layer (UBL) is a term frequently used to refer to the atmospheric boundary layer (ABL) over an urban area, a type of ABL distinguished by its underlying complex and heterogeneous surface. Analogous to a tall vegetation canopy, the urban surface consists of buildings that disrupt the flow of air within and above, generating turbulent eddies

and reducing wind speed in the vicinity of the canopy (roof top and within the canopy (Roth, 2000)). In addition, the urban surface is typically composed of artificial materials (asphalt, concrete, brick, etc.) whose physical (e.g., albedo, thickness, evaporation efficiency) and thermodynamic properties (e.g., heat capacity, thermal conductivity, emissivity) often differ greatly from natural surfaces (Oke, 1987). Consequently, these artificial surfaces and additional anthropogenic sources can alter the local energy balance. This combination of disruption to the local dynamics and energy balance has broad local and regional implications on meteorology and air quality.

The presence of an urban surface introduces further complexity to the flow in the surface layer of the ABL. The roughness sublayer (RSL) of the atmospheric surface layer can be broadly defined as a layer of strong vertical shear with non-uniform turbulent motions (e.g., wake eddies, plumes) scaled by the local roughness element height and inter-element spacing (Rotach, 1999; Roth 2000; Arnfield, 2003). At the height where these turbulent motions become sufficiently well-blended and turbulent fluxes become constant with height the RSL is replaced by the inertial sublayer (Rotach, 1999; Roth 2000; Arnfield, 2003), which extends through the remaining depth of the surface layer. The RSL depth over vegetation typically varies from 0.5 to 50 m above the ground (Garratt, 1992) or approximately  $2 \times z_R$  to  $5 \times z_R$  or more (Roth, 2000), where  $z_R$  is the roughness element height. Over urban surfaces, where buildings frequently dominate the roughness elements and provoke larger turbulent eddies, the observed RSL depth can occupy the bulk of the surface layer (Rotach, 1999; Barlow and Cocea, 2009). The length scale and characteristics of turbulent motions can change between the inter-building space (urban canyon) and the region immediately above the rooftop, introducing a further subdivision known as the urban canopy layer (UCL) where the observed wind profile often described as exponential (Macdonald, 2000). In addition to element



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height and inter-element distance, turbulent eddy characteristics within an urban RSL are also particularly sensitive to the element (building) orientation, dimension and density, collectively referred to as the urban “morphology” (Cheng and Castro, 2002).

The urban surface energy budget is sensitive to the morphology (Oke, 1981, 1982). Buildings can cast shadows, reducing the infiltration of direct short wave radiation into urban canyons, while potentially increasing diffuse radiation via reflection (Mills, 2004). Buildings can also reduce canyon wind speed, limiting the upward turbulent heat flux and canyon ventilation, rendering canopy morphology characteristics, such as the aspect ratio (H:W) an important influence on flux strength (Coutts et al., 2007). Large buildings can function as heat storage mechanisms (Kawai and Kanda, 2010), increasing daytime up-take and nighttime emission to the urban environment. Building emissions may also be considered part of an anthropogenic heat flux contribution to the energy budget (Nunez and Oke, 1977; Sailor, 2009), which can also include contributions from vehicular exhaust, industrial effluents and building ventilation.

The presence of vegetated surfaces in an urban environment can yield evapotranspiration, contributing to the turbulent latent heat flux component of the surface energy budget (Grimmond and Oke, 1999a). The magnitude of this contribution to the surface energy budget can be dramatically reduced, however, in the absence of sufficient moisture or irrigation (Grimmond and Oke, 2002; Christen and Vogt, 2004; Offerle et al., 2006a) and can vary substantially for isolated versus more densely spaced vegetation (Offerle et al., 2006b; Hagishima et al., 2007). The fraction covered by vegetation per unit surface area can dictate the signature of the local surface energy budget (Grimmond and Oke, 2002; Kanda, 2007). For example, residential sites with abundant vegetation and low structural density can more closely emulate a rural surface energy budget than an urban one (Balogun et al., 2009). As the vegetation fraction increases in urban environments, the ratio of heat storage to net radiation decreases (Kanda, 2007; Pearlmutter et al., 2009) while a reduction of vegetation and soil water storage increases urban heat storage due to increased radiative trapping and impervious surfaces (Coutts et al., 2007). Uncertainty in the experimental understanding of the response of the surface energy budget to change in the coverage by vegetation is coupled with considerable uncertainty in the modeling parameterizations of urban turbulent latent heat flux (Best et al., 2006; Grimmond et al., 2010). Exclusion of vegetation in the modeling of an urban surface energy balance can be detrimental to model estimation of daytime turbulent sensible heat flux, net radiation and heat storage as well (Grimmond et al., 2010).

Early modeling work evaluated the UBL in one and two-dimensional simulations, treating the urban surface as a rough-wall, (a.k.a, “slab”, “sandbox” approach), (Myrup, 1969; Delage and Taylor, 1970; Vukovich, 1973; Bornstein, 1975). Current efforts to numerically model the UBL span

a variety of approaches. Recent computational fluid dynamics (CFD) studies focus on simulating flow within the urban canyon or an idealized channel. Such CFD approaches include Direct Numerical Simulation (DNS): (Leonardi et al., 2003) Reynolds Averaged Navier-Stokes (RANS): (Kim and Baik, 1999) and Large-Eddy Simulation (LES): (Walton et al., 2002; Walton and Cheng, 2002). A viable compromise of computational efficiency and accuracy of dynamics and thermodynamics in the urban environment is the mesoscale NWP approach. Mesoscale models alone can only parameterize these processes in bulk subject to the scale of the surface land cover representation. Studies seeking to simulate the real urban environment through this approach often adopt an urban canopy model (UCM) or similar parameterizations (Masson, 2000; Kusaka et al., 2001; Martilli et al., 2002; Lee and Park, 2008; Miao et al., 2009). This study evaluates urban meteorology at the mesoscale using a single layer UCM coupled to a numerical weather prediction (NWP) model: the Weather Research and Forecasting (WRF) Advanced Research model v2.2 (WRF-ARW, see Sect. 2.1). The single layer UCM used here progresses toward a closer approximation of physical processes in the real urban environment versus the sandbox approach by estimating urban canyon wind speed, sky view factor, short and longwave radiation reflection and surface energy balance at the roof, wall and road facets of the urban canopy. Subsequent WRF model generations incorporate additional functionality for urban surface parameterization. Where sufficient morphology and building energy data is available for application, the Building Environment Parameterization (BEP; Martilli et al., 2002) option permits a multi-layer canopy model that can extend above the lowest model layer and the Building Energy Model (BEM; Salamanca and Martilli, 2009) can incorporate the effect of heating and cooling systems.

In balancing the computational expense of a large NWP model with the need for accuracy, of critical concern is the optimal scale for surface representation. This study investigates the nature of the error in the model meteorology that evolves specifically from a reduced scale of surface representation. The model examines a real urban area under fair weather conditions, concentrating on the response of the surface energy budget, temperature, turbulence kinetic energy, stability and near-surface flow. Section 2 outlines the model and methods adopted. Section 3 offers model verification. Section 4 outlines the principal results and analysis and Sect. 5 offers conclusions.

## 2 Method

### 2.1 WRF-ARW model

This study uses the Weather Research and Forecasting Model (WRF) Advanced Research (ARW) version 2.2 (Skamarock et al., 2007) to simulate the mesoscale

meteorology. The model time integration uses a third-order Runge-Kutta scheme; horizontal advection of momentum and scalars uses a fifth-order scheme, third-order in the vertical. This study makes use of the model's Rayleigh damping term to stabilize vertical momentum when the vertical velocity approaches the Courant number for stability as well as a sixth-order numerical diffusion term in the horizontal momentum equations to filter short-wave numerical noise. Horizontal eddy viscosity is determined from the Smagorinsky first-order closure method (Smagorinsky, 1963). Two-way interactive nested grids are invoked, with a 4-grid point relaxation zone boundary condition.

This study selects the Mellor-Yamada-Janjic (MYJ) ABL scheme (Janjic, 2002) and accompanying Eta surface layer model to parameterize the ABL. Vegetation and other land surface processes are parameterized using the Noah land surface model (LSM) (Chen and Dudhia, 2001). Cloud microphysics is parameterized according to the WRF Single Moment 3-Class scheme (Hong et al., 2004). Cumulus cloud parameterization is applied only in the coarsest model grid (see Sect. 2.2) according to the Kain-Fritsch scheme (Kain, 2004; Kain and Fritsch, 1993). Longwave radiation is parameterized according to Rapid Radiative Transfer Model of Mlawer et al. (1997) and shortwave radiation according to Chou and Suarez (1994). Initial conditions are taken from NCEP Eta 212 grid (40 km) model analysis (a.k.a., "AWIP") data available from the University Corporation for Atmospheric Research (UCAR) in three-hour increments at 26 vertical levels from 1000 hPa to 50 hPa. The AWIP data initializes the parent domain (see Sect. 2.2) and all nested grids at the start of model integration and provides boundary conditions for the parent domain.

To model the urban environment, WRF-ARW v2.2 provides a single layer urban canopy model (UCM) of Kusaka et al. (2001). This UCM represents urban areas as two-dimensional street canyons of infinite length without specified street orientation, designed as an extension to the Noah LSM. The UCM balances all energy sources locally at the four-layer road, wall and roof surfaces of each model grid cell: the surface energy balance is calculated independently at each surface (roof, wall and road) by iteratively (Newton-Raphson) manipulating the local skin surface temperature to adjust the heat fluxes the sum is sufficiently close to zero and the skin surface temperature ( $T_s$ ) and diagnostic mean canyon air temperature ( $T_c$ ) are in steady-state. The contribution of heat flux from each surface is scaled according to the normalized length of the roof ( $R$ ), wall ( $h$ ) and road ( $R_w$ ) where  $R + R_w = 1$ . The WRF preprocessor (WPS) assigns a single surface cover class to each grid cell according to the selected surface cover dataset (see Sect. 2.2). The LSM uses the corresponding class physical and thermodynamic parameters (e.g., albedo, emissivity, roughness length) to calculate the surface heat fluxes. In the case of a grid cell surface class defined as "urban" (in the dataset used there are four such classes: Sect. 2.2), the LSM defines the (total) grid

cell heat flux from the surface as the sum of flux from artificial/anthropogenic surfaces (calculated from the UCM) and the natural surface (defined automatically as a "grassland" class), partitioned according to the grid cell fractional coverage by the artificial surface ( $f_{\text{URB}}$ ), e.g., for sensible heat flux:

$$H_{\text{total}} = f_{\text{URB}} H_{\text{urban}} + (1 - f_{\text{URB}}) H_{\text{natural}} \quad (1)$$

The single class surface cover assignment approach in mesoscale modeling can yield dissimilar flux estimates versus an approach that aggregates flux from sub-grid scale class fraction; the former is shown to be more sensitive to resolution change (Schlünzen and Katzfey, 2003). A diagnostic mean canyon wind speed is computed from an exponential function subject to the geometry of the canyon and speed of the flow above (Kusaka and Kimura, 2004). Further detail of the UCM and its coupling to WRF are presented by Kusaka et al. (2001) and Kusaka and Kimura (2004).

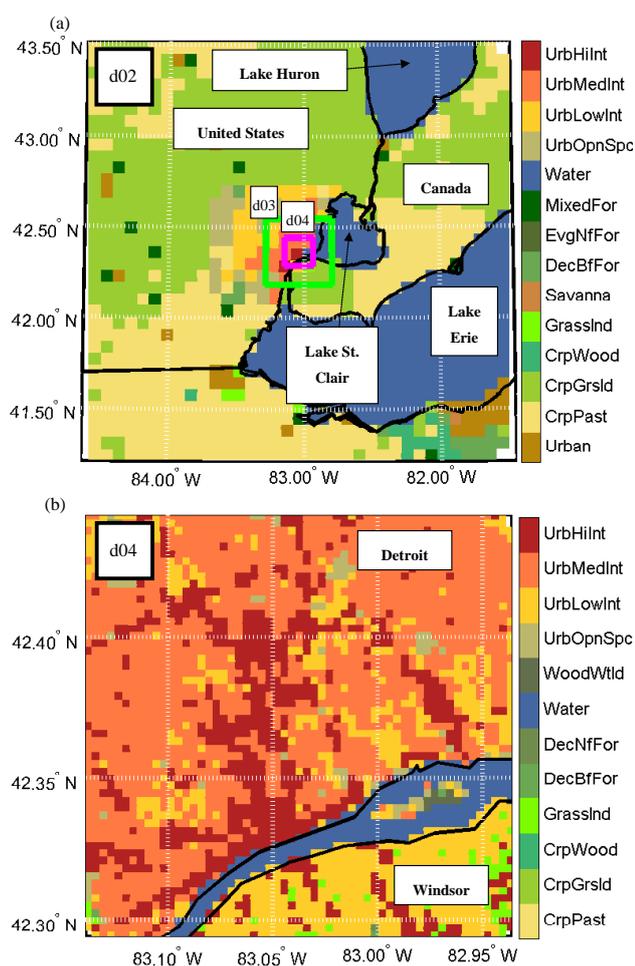
Some minor adjustments were made to the parameter settings for application to the Detroit-Windsor domain. The internal roof and wall temperature were set to 298.15 K to reflect a typical summertime mid-latitude interior building temperature (Walker, 2006). The internal road (ground) temperature was set to 295.25 K to reflect the approximate seasonal (JJA) average surface (2 m a.g.l.) temperature at Detroit-Windsor (National Weather Service-Detroit/Pontiac, 2010). A four-class urban land surface type approach (Grimmond and Oke, 1999b) is used in place of the default three-class approach. Table 1 lists the principal gridded urban parameters by type, a blend of values recommended by Grimmond and Oke (1999) and morphological estimates from remote sensing imagery. The non-gridded urban parameters (e.g., surface albedo, thermal conductivity and surface emissivity, etc.) were selected following a review of common parameterizations in the literature for similar implementations (Lee and Park, 2008; Miao et al., 2006; Kusaka and Kimura, 2004; Martilli, 2002; Masson, 2000), in conjunction with default UCM values.

## 2.2 Domain

The area of interest is the Detroit-Windsor metropolitan area, estimated population: 4 726 779 (Statistics Canada, 2006; United States Census Bureau, 2010) straddling the US-Canada border (Fig. 1). This urban area is located in the Great Lakes region of North America, an area of generally flat topography adjacent to multiple, large fresh water bodies. The Detroit River separates the cities of Detroit and Windsor and extends from Lake St. Clair in the east to Lake Erie in the south. The model domain consists of one parent grid, stretching across the contiguous US and southern Canada, and three telescopically nested grids ( $\Delta x = 37.5, 7.5, 1.5$  and  $0.3$  km, respectively). Grid 1 extends across 140 (86) grid-points from west to east (north to south); both grids 2 and 3 are of squares of 36 gridpoints per side and grid 4 is a square

**Table 1.** Values assigned to gridded urban parameters in the WRF urban canopy model according to surface type.

Urban Surface Type Classification	Bldg. Height (m)	Roughness Length, Disp. Height (m)	Norm. Bldg. (Road) Width	Norm. Bldg. Height	Drag Coeff.	Bldg. Volume Parm.	Urban Fraction
Open Space	7	0.7, 1.4	0.50 (0.50)	0.337	0.037	0.28	0.10
Low Intensity	7	0.7, 3	0.50 (0.50)	0.337	0.053	0.28	0.35
Medium Intensity	10	1.0, 6	0.63 (0.37)	0.242	0.083	0.40	0.65
High Intensity	16	1.6, 11	0.81 (0.19)	0.190	0.123	0.64	0.90



**Fig. 1.** Surface land cover type over the 2nd (a) and 4th (b) grids of the model domain over Detroit-Windsor (see Appendix A for abbreviations). Outlines of the 3rd grid (d03: green) and 4th grid (d04: magenta) appear in (a). The 1st grid (d01, not shown), is centered at 42.26° N, 93.10° W and extends across approximately 64° longitude and 29° latitude.

of 66 gridpoints per side. The model was run with 59 vertical levels and set to have approximately 21 levels in the lowest kilometer.

The resolution of the innermost grid (d04) approaches the limit of viability for application of the MYJ scheme to represent ABL turbulence; the scale of some eddies in the afternoon well-mixed layer in cases examined here likely briefly exceed the d04 grid scale. However, model TKE damping at the highest resolutions (energy cascade compensation) leads to an effective model resolution of approximately  $7\Delta x$  (Skamarock, 2004), or approximately 2.1 km in d04 here. This scale exceeds  $h_{ABL}$  throughout the d04 grid in the test cases examined here. In addition, Miao et al. (2009) demonstrate successful implementation of the MYJ ABL scheme in WRF at similarly high resolution (0.5 km) under fair-weather, warm-season conditions using the single layer UCM with comparable vertical resolution. Similarly, Gutiérrez et al. (2010) and Salamanca et al. (2010) indicate success with a 0.333 km grid scale using the Bougeault-Lacarrère (BouLaC) ABL scheme (Bougeault and Lacarrère, 1989) with WRF, a TKE-prediction scheme like MYJ.

To create a high-resolution four-class urban land surface type dataset, the international border bisecting the domain necessitated a splice of three sources of land surface type data. These sets included the USGS National Land Cover Dataset (NLCD 2001), the NOAA Coastal Resources Center (CRC) Land Use Dataset and the Ontario Ministry of Natural Resources (MNR) Land Cover dataset. The USGS NLCD (2001) set consists of a raster image of Albers Equal Area Conical projection with 22 land surface type categories equally spaced at a resolution of one arc-second. Among the 22 land use categories are four designed to characterize the urban surface: (1) developed, open space, (2) developed, low intensity, (3) developed, medium intensity and (4) developed high intensity, in order of increasing density of structures and of anthropogenic influence on the surface. These categorical surface classifications are selected for the four-class scheme used here; the morphological differences can be found in Table 1. The NOAA CRC data is of identical projection and resolution to USGS NLCD (2001), but distinguishes only two categories of urban surface (low and high intensity). The NOAA CRC data covers the Lake St. Clair watershed, covering approximately 20–25 km inland of the lake shore, including the city of Windsor. The MNR data is

a raster image of Lambert Conformal Conic projection with 28 land surface types and pixels evenly spaced in intervals of 25 m available with geo-reference coordinates. Of the 28 land surface types, one is reserved for classification of urbanized surfaces. To create a common set of land surface types, the MNR categories were mapped to the corresponding USGS categories with the MNR urban type assigned to the developed, medium intensity category. The MNR data covers all land surfaces within Ontario.

The USGS NLCD (2001), NOAA CRC and MNR datasets were spliced together using GIS algorithms and software. To enable tests of systematically varying land surface resolution, the sets were gridded into intervals of 10, 20, 30, 60 and 120 arc-seconds in separate procedures. In regions of resource data overlap, all three resources contributed equally to the categorical assignment of each grid cell. An exception is made for those cells classified as urban surface, in which case classification was left to the mode classification of the USGS NLCD (2001) dataset over Detroit and the NOAA CRC dataset over Windsor. The resulting five blended, gridded land surface datasets are raster images of uniformly spaced pixels with categorical assignments to one of the 33 land surface types defined by the USGS NLCD (2001). Remote sensing imagery provided verification of the land surface raster images.

### 2.3 Case studies

The five gridded raster images of the Detroit-Windsor metropolitan area described above provide a source to understand how change in the representation of the urban surface under a common model resolution manifests through the model-estimated meteorology. This study runs five test cases, distinguished only by the scale of surface representation in arc-seconds (s): 10, 20, 30, 60 and 120; model resolution is held constant.

The finest resolution case (10 s) was chosen to reflect the “neighborhood” scale  $O$  ( $10^2$  m), capable of capturing the mean geometric and thermodynamic properties of a particular urban neighborhood without the need to explicitly resolve individual buildings or street canyons, as would likely be necessary at finer resolutions. Model estimates from case 10 s runs represent the model’s best-guess for simulation of the meteorology. Departure from these model estimates in coarser case runs represents sensitivity to the scale of representation of the surface. In lieu of sufficient verification at this site, statistical analyses provide a measure of the model sensitivity to surface cover resolution and can permit some understanding of how overall model performance changes.

Analysis is mostly limited to the fourth model grid (Fig. 1), concentrating on two periods within the Border Air Quality and Meteorology Study (BAQS-Met) 2007 field campaign: 12:00 UTC 23 June – 12:00 UTC 25 June 2007 (Period 1) and 00:00 UTC 7 July–00:00 UTC 8 July 2007 (Period 2), with the first six-hour Period withheld from analysis to allow for

model spin-up time. For both periods, local time in Detroit-Windsor is (UTC–4) hours. The surface water temperature is held constant according to initial conditions throughout the duration of the model integrations. The two periods provide a useful archive for response under varying wind speed and direction. Both periods are dry and generally cloud-free over the analysis area, dominated by synoptic-scale high pressure (1016–1019 hPa). In Period 1, nearly calm winds on 23 June yield to increasing south-southeast flow late on 24 June. Low-level winds gradually veer to southwest after 00:00 UTC 25 June as high and mid-level cloud cover increase gradually ahead of a weak extratropical cyclone. In Period 2, morning low-level wind speeds are nearly calm, increasing to 2–5  $\text{ms}^{-1}$  from the southwest by afternoon.

## 3 Model verification

To test the validity of model estimates in the urban boundary layer, a thorough verification of the model configuration is necessary. The BAQSMet 2007 field campaign included a series of flights by a Twin Otter aircraft measuring meteorological and chemical quantities at various heights across southwestern Ontario and adjacent areas around Detroit. The Twin Otter datasets serve as the crux of model verification data in the Detroit-Windsor domain, supported with additional data from radiosondes, METAR and a VHF wind profiler.

To complement this verification with a more precise diagnosis of model performance within and above the urban canopy, additional model comparison studies were conducted over Oklahoma City, OK, USA (omitted here). These comparison studies utilized measurements from the Joint Urban 2003 field campaign (Allwine et al., 2004) to verify model estimates.

### 3.1 Instrumentation

BAQS-Met 2007 field data includes a series of measurements taken on-board the National Research Council (NRC) Twin Otter Atmospheric Research Aircraft (hereinafter: Twin Otter). Instrumentation aboard included an array of air sampling equipment and meteorological instruments (Srinivasan and Bastian, 2008). Two flights crossed the urban core grid of the domain and are used here for model verification: Flight #12 (3–4 July 2007) and Flight #13 (6–7 July 2007). Measurements of three-dimensional wind, temperature ( $T$ ), dew point temperature ( $T_d$ ) and air pressure ( $p$ ) were extracted for model verification.

Several additional stationary sources supplement Twin Otter data toward model verification. Radiosonde launches (with GPS) by the US National Weather Service (NWS) at White Lake, Michigan, (KDTX: 42.70° N, 83.47° W) provide a useful comparison for temperature, water vapor mixing ratio ( $q$ ), wind speed ( $|\vec{u}|$ ) and wind direction ( $\vec{u}_\theta$ ). This station is located within the second grid

of the model domain, west of Detroit-Windsor. Profiles are extracted from the launch times nearest to Flights #12 and #13. During Twin Otter Flight #13, three missed landings took place at airports with hourly Aviation Routine Weather Reports (METAR) available from in situ instruments at field level (Plymouth State University, 2010), two of which coincide within several minutes of METAR data, providing points of surface verification.

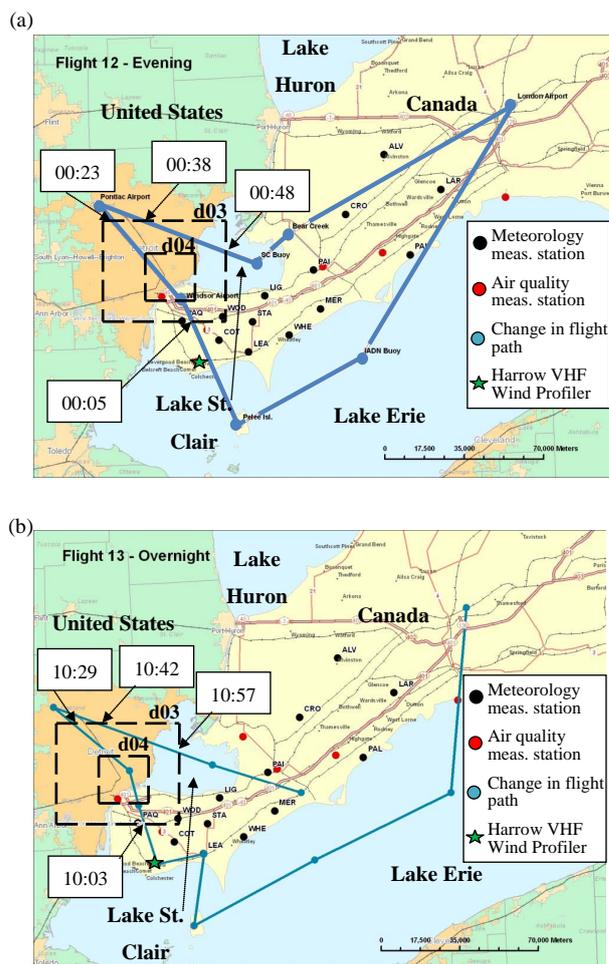
A VHF wind profiler installation at Harrow, ON ( $42^{\circ} 42' N$   $83^{\circ} 28' W$ ), part of the Ontario-Quebec VHF Wind Profiler Network (Hocking and Hocking, 2007), provides hourly horizontal wind speed and direction measurements in 500 m range gates throughout much of the troposphere. Data is available for comparison during both study periods when and where sufficient signal return is present, but no data is available during Flight #12. The wind profiler is situated in the second model grid, approximately 50 km south-southeast of the urban core of Detroit-Windsor (Fig. 2).

### 3.2 Data quality control

Measurement of the true air velocity on-board the Twin Otter is subject to uncertainty caused by the blending of instrumentation to produce the final dataset (Srinivasan and Bastian, 2008). A correction was made to compensate for a systematic horizontal wind error for the two flights examined here (K. Hayden, Environment Canada, personal communication, 2009). To reduce bias in vertical velocity measurements, the 1 Hz instantaneous moments of vertical velocity were detrended by removing the mean vertical velocity.

To mitigate white noise in these datasets of 1 Hz sampling frequency, a one-minute average was taken for all variables. This averaging Period was selected to facilitate model-measurement comparison; model estimates were archived in one-minute sampling intervals (instantaneous) for the duration of each flight. The 1 Hz data was retained for the calculation of turbulence kinetic energy (TKE) per unit mass.

To verify model estimates, this study uses a 16-point linear interpolation algorithm to map model estimates to observation space (Eq. 2). Given an observed variable  $y$  at  $y(i_0, j_0, k_0, l_0)$  where  $i_0$  and  $j_0$  reflect the horizontal position,  $k_0$  the vertical position and  $l_0$  the temporal position, the algorithm seeks the nearest model estimates of the model variable  $x$ , which may be a variable identical to  $y$  or in need of conversion (e.g., dew point temperature to mixing ratio). The algorithm extracts  $x$  at the four model grid points surrounding  $y(i_0, j_0, k_0, l_0)$  in horizontal, two-dimensional space at the two model vertical levels that enclose the height of the observation ( $k_0$ ). The algorithm then extracts these eight points at the two model output times that enclose the observation time ( $l_0$ ). The algorithm then interpolates the model variable to the point of observation,  $\hat{x}(i_0, j_0, k_0, l_0)$ , by applying weights to  $x$  at the 16 grid points determined earlier. The weights are inversely proportional to the three-dimensional



**Fig. 2.** The approximate flight paths of Flight #12 (a) and #13 (b) during BAQS-Met 2007, depicted by the blue line. The third (d03) and fourth (d04) model grid domains are outlined in dashed black lines with boxes indicating the approximate UTC time (4 July 2007 (a), 7 July 2007 (b)) upon entering and exiting the d03 domain. Adapted with permission from a figure by Julie Narayan, Environment Canada.

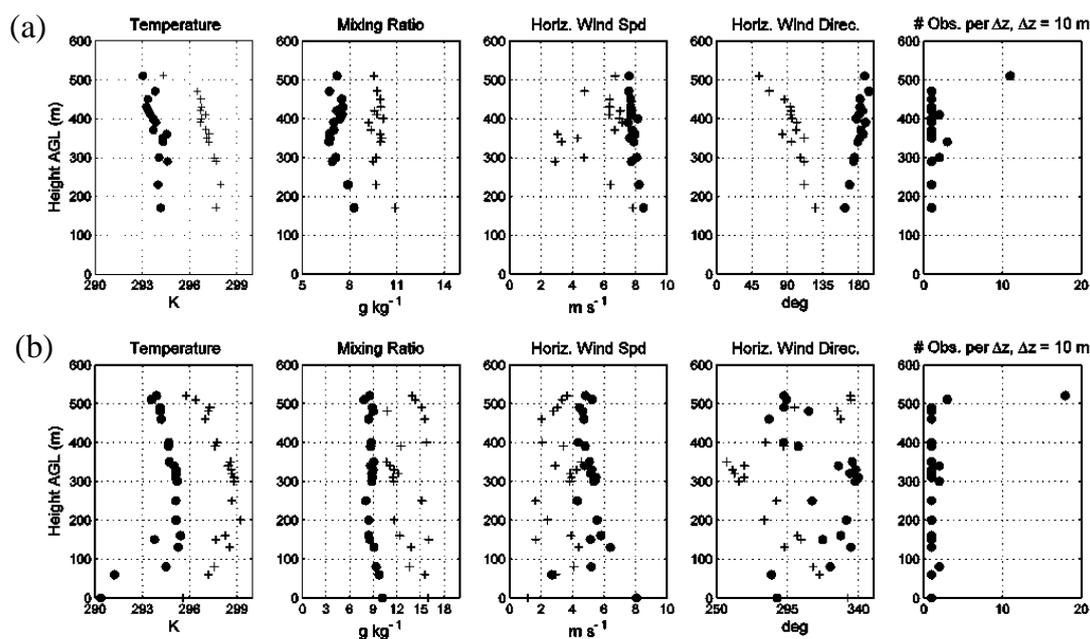
distance ( $d$ ) or time ( $t$ ) between the model grid point and the observation according to Eq. (2)

$$\hat{x}(i_0, j_0, k_0, l_0) = \sum_{m=1}^2 \left( \frac{\frac{1}{l_m}}{\sum_{m=1}^2 \frac{1}{l_m}} \right) \sum_{n=1}^8 x_n(i_n, j_n, k_n, l_n) \cdot \left( \frac{\frac{1}{d_n}}{\sum_{n=1}^8 \frac{1}{d_n}} \right) \quad (2)$$

On the basis of the high resolution of the gridded model data in the region of verification (generally near the surface), error associated with the linear interpolation of model estimates is assumed to be significantly smaller than the resulting model biases (see Sects. 3.3, 3.4).

**Table 2.** RMSE (top) and mean bias (bottom) of model estimates for selected variables vs. verification datasets including aircraft data (T. O. = “Twin Otter”), radiosonde (KDTX) and a VHF wind profiler (Harrow Profiler).

RMSE	Temp. (K)	Water Vapor Mixing Ratio (g kg <sup>-1</sup> )	Horiz. Wind Speed (m s <sup>-1</sup> )	Horiz. Wind Direction (°)	Comparison Points
T.O. Flgt #12 (3–4 July)	2.71	2.58	2.48	105.46	30
T.O. Flgt #13 (6–7 July)	3.01	5.44	2.11	47.53	43
KDTX (00:00 UTC 4 July)	3.77	0.71	2.84	7.79	65
KDTX (12:00 UTC 7 July)	4.01	0.70	2.96	18.98	58
Harrow Profiler (7 July)	n/a	tn/a	1.92	25.33	270
Bias					
T.O. Flgt #12 (3–4 July)	-2.52	-2.55	1.91	100.70	30
T.O. Flgt #13 (6–7 July)	-2.83	-4.90	1.61	-6.05	43
KDTX (00:00 UTC 4 July)	2.43	-0.06	0.87	-3.05	65
KDTX (12:00 UTC 7 July)	2.14	0.38	1.40	-12.67	58
Harrow Profiler (7 July)	n/a	n/a	-0.36	3.02	270

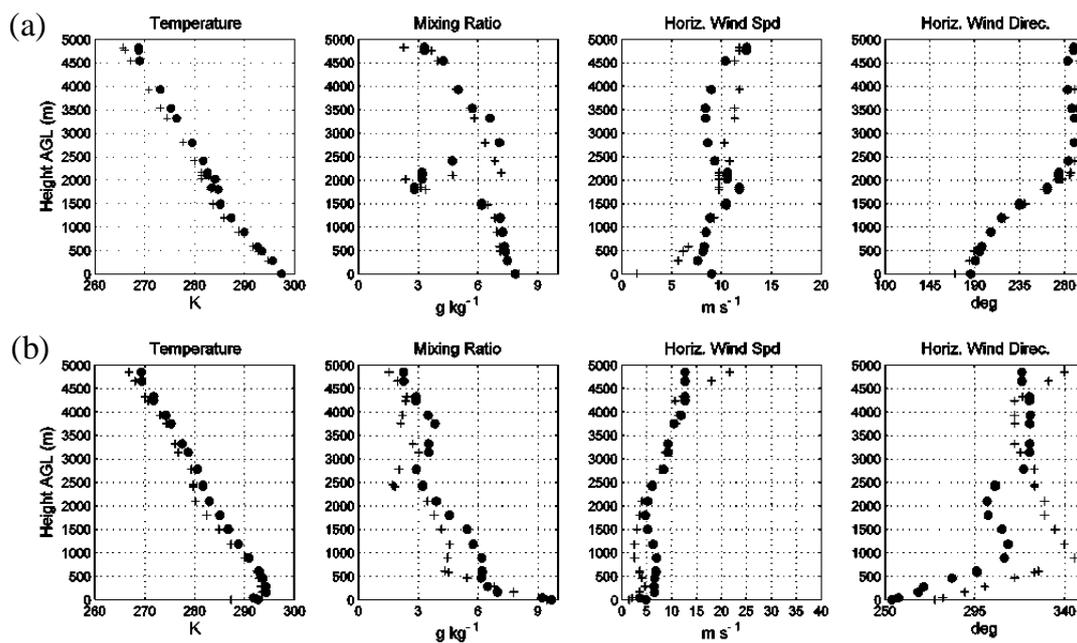
**Fig. 3.** Model verification versus height using Twin Otter Flight #12 (3–4 July 2007, (a)) and Flight #13 (6–7 July 2007, (b)) measurements intercepting the third model grid. Variables depicted include: temperature, water vapor mixing ratio, scalar-average horizontal wind speed and horizontal wind direction. Model estimates are interpolated to observations and both are organized into 10 m bins. Each column shows the (bin-averaged) observed values (+) and model estimates (circles). The number of comparison points contributing to each bin is shown at the far right.

### 3.3 Flight #12

BAQS-Met 2007 Twin Otter Flight #12 crossed through the third grid of the model domain between 00:05 and 00:48 UTC 4 July 2007, exiting the northwest corner of the domain for 15 min within that Period for a course change at Oakland International Airport (KTPK) in Pontiac, Michi-

gan, USA (Fig. 2a). Within the third model grid, the flight level varies between roughly 300 to 500 m a.g.l., except in the final minutes when the aircraft descends to approximately 170 m a.g.l.

A majority of measurements are clustered near 510 m a.g.l. (Fig. 3). Comparison indicates a cold model bias in air temperature (Table 2), though this bias is noticeably smaller



**Fig. 4.** Model verification versus height using radiosonde measurements of temperature, water vapor mixing ratio, scalar average horizontal wind speed and horizontal wind direction in the lowest 5 km at KDTX ( $42^{\circ} 42' N$   $83^{\circ} 28' W$ ) 00Z 4 July 2007 (a) and 12Z 7 July 2007 (b). Model estimates are interpolated to observations and both are organized into 10 m bins. Each column shows the (bin-averaged) observed values (+) and model estimates (circles).

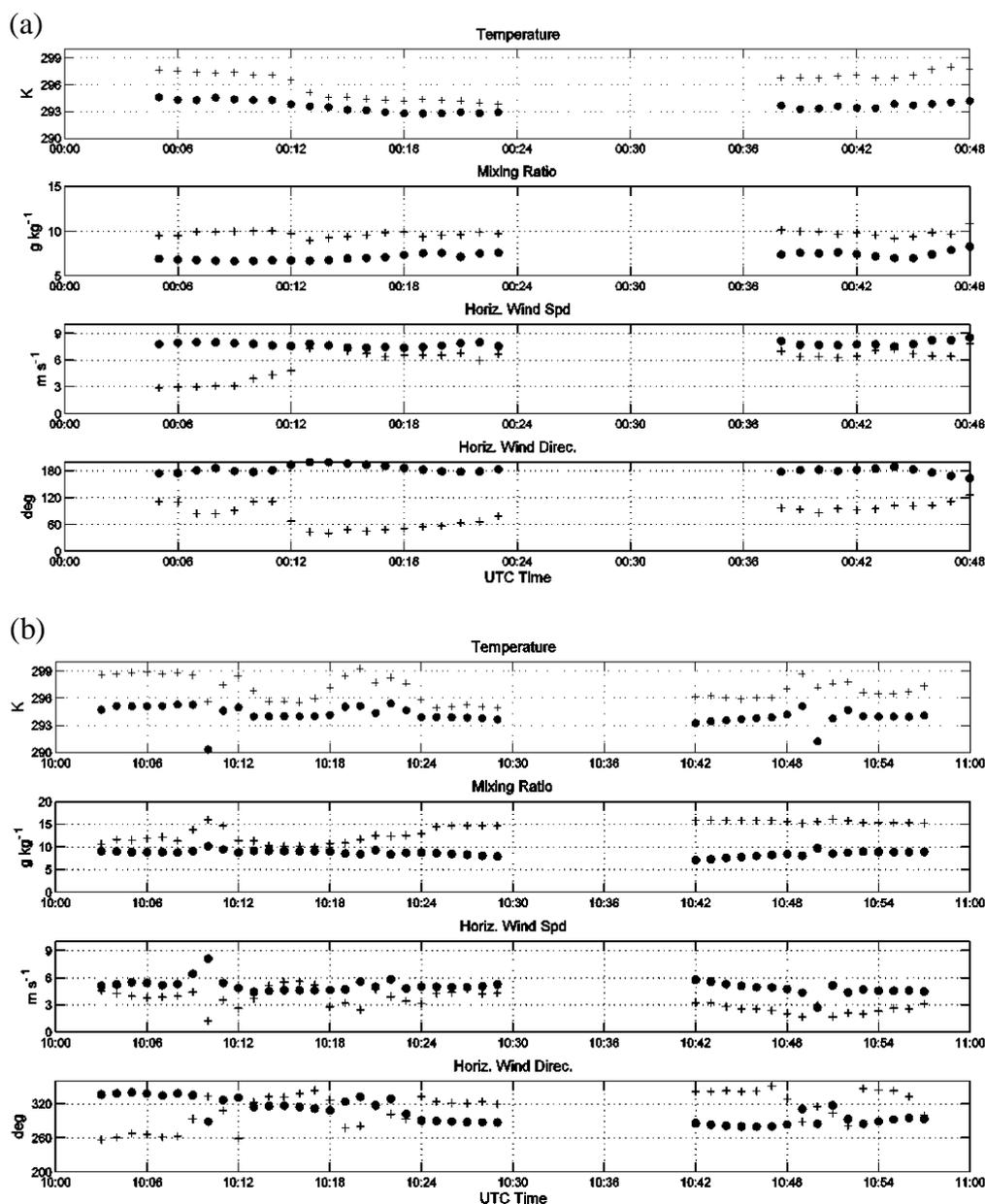
where Twin Otter data is most abundant. Mamrosh et al. (2002) report a mean bias of around +1 K for commercial aircraft (ACARS) measurements versus adjacent radiosonde measurements (within 10 km), below 400 hPa. Ballish and Kumar (2008) find a bias of +0.6 to 1.5 K at 925 hPa using AMDAR data, which is roughly 20 to 40 hPa above most flight measurements here. Although instrumentation differs among these comparisons, this may partly explain the cold model bias. Comparing against 00Z 04 July 2007 radiosonde data (Fig. 4), model estimates overestimate temperature by 1–2 K in the lowest 2 km, and by  $\sim 2$  K above that.

There is also a significant dry model bias (around  $-2.5 \text{ g kg}^{-1}$ ) relative to Twin Otter measurements (Table 2) that appears to be insensitive to height. This dry bias is not present in model comparison to the radiosonde data. Mamrosh et al. (2002) indicate a mean dew point temperature bias of approximately +1.8 K among ACARS data. The presence of a similar moist bias, versus the true atmospheric state, in the Twin Otter measurements would suggest that model estimates are much closer to the true atmospheric state than suggested by this verification, though quantitative measurement error from these Twin Otter observations was unavailable.

Model performance with wind estimation is less clear; the model consistently overestimates scalar-average horizontal wind speed versus Twin Otter measurements. Comparison with radiosonde data suggests model overestimation below the model-estimated boundary layer depth ( $h_{\text{ABL}} \sim 939 \text{ m}$ ),

with varying performance above. Wind direction also shows discrepancy versus Twin Otter measurements. Some of this can be explained by the relatively light wind speeds. This discrepancy, together with an unexplained backing of the winds, leaves some uncertainty in the Twin Otter wind measurements. Model estimated wind direction shows strong coherence with the 00Z 4 July 2007 radiosonde data (Fig. 4), with a model RMSE of  $7.79^{\circ}$  for the full profile (Table 2). Model estimated TKE shows fairly strong coherence with observations, including a local peak near 400 m a.g.l. (not shown).

Examining model performance versus time (Fig. 5), Twin Otter temperature measurements during an ascent near 00:12 UTC 4 July suggest a highly unstable local lapse rate of  $13 \text{ K km}^{-1}$ , not captured by the model. This observed feature is not replicated during the subsequent descent (00:37–00:48 UTC), whereas the model response is proportionally opposite. Similar behavior is shown for wind speed with Twin Otter measurements indicating steadily increasing wind speed during ascent. The horizontal wind speed shows the strongest coherence of model and measurement directly over downtown Detroit, at 510 m a.g.l. Comparison of wind speed to 00:00 UTC METAR at Windsor Airport (CYQG:  $42.27^{\circ} N$ ,  $82.97^{\circ} W$ ) reveals surface (10 m a.g.l.) winds of less than  $2.5 \text{ m s}^{-1}$ , justifying the Twin Otter measurements. For wind direction, Twin Otter measurements suggest erratic change over short distances and largely differ from



**Fig. 5.** Model verification versus time using Twin Otter Flight #12 (3–4 July 2007, **(a)**) and Flight #13 (6–7 July 2007, **(b)**) measurements intercepting the third model grid. Variables depicted include: temperature, water vapor mixing ratio, scalar-average horizontal wind speed and direction. Model estimates are interpolated to observations and both are organized into 1 min bins. Each row shows the (bin-averaged) observed values (+) and model estimates (circles).

METAR at CYQG (south at 00:00 UTC, south-southwest at 01:00 UTC) and Coleman A. Young International Airport (KDET: 42.42° N, 83.02° W, south-southeast at both 00:00 and 01:00 UTC). These METAR wind directions match very well with model estimated wind direction.

### 3.4 Flight #13

BAQS-Met 2007 Twin Otter Flight #13 crossed the third grid of the model domain between 10:03 and 10:57 UTC 7 July 2007, exiting the northwest corner of the domain for 13 min near the middle for a course change at KPTK (Fig. 2b). Within the third model grid, the flight level varies across the lowest 520 m a.g.l., including three missed landings at

**Table 3.** Measurements and model estimates for two missed landing maneuvers during Twin Otter Flight #13, 7 July 2007. Airport measurements (CYQG, KDET) are taken from METAR, with scalar quantities measured at 2 m a.g.l. and wind measured at 10 m a.g.l. The height of Twin Otter measurements is a 1-min average. Model estimates are interpolated to the averaged Twin Otter measurement height.

	Missed Landing: 10:10 UTC		Missed Landing: 10:50 UTC			
	CYQG (10:00)	Twin Otter (10:10)	Model (10:10)	KDET (10:53)	Twin Otter (10:50)	Model (10:50)
Measurement Hgt (a.g.l.)	2, 10 m	8 m		2, 10 m	68 m	
Temperature (K)	292.2	295.6	290.3	291.5	297.2	291.1
Mixing ratio (g kg <sup>-1</sup> )	10.2	15.9	10.2	10.2	15.6	9.7
Horiz. wind speed (m s <sup>-1</sup> )	1.5	1.2	7.3	1.5	2.9	2.8
Wind direction (°)	290	333	287	290	315	286

airports within the model grid (10:10, 10:21, 10:50 UTC). Being an early morning transect, measurement points fall above the model estimated  $h_{\text{ABL}}$  (<200 m a.g.l. throughout the period) except for the missed landings.

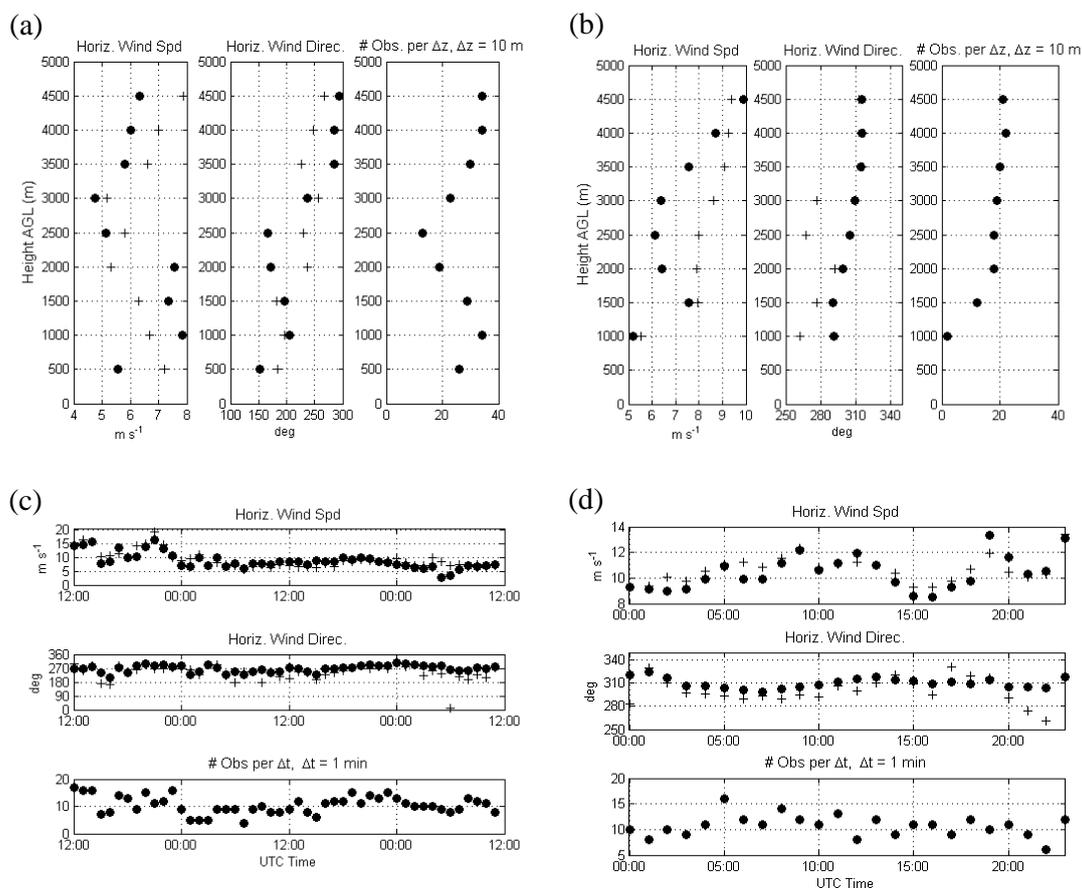
The vertical comparison (Fig. 3) confirms the cold and dry model bias seen in Flight #12, though both indicate a strong low-level temperature inversion. A model warm bias aloft versus radiosonde data is apparent. However, the radiosonde may drift horizontally up to 300 km during a typical two-hour ascent (NOAA National Weather Service, 2010).

A model dry bias versus Twin Otter measurements is present, as in Flight #12. Whereas model estimates suggest a generally uniform water vapor mixing ratio, Twin Otter measurements indicate significant fluctuation, varying by as much as 6 g kg<sup>-1</sup> in the lowest 500 m a.g.l. (Fig. 3). This observed variation cannot be wholly explained by the flight path over Lake St. Clair, sudden wind shifts or any recent rainfall. There is a much stronger coherence of model estimates to radiosonde water vapor mixing ratio measurements, with RMSE under 1 g kg<sup>-1</sup> and smaller mean bias. During the course of radiosonde ascent, model estimated  $h_{\text{ABL}}$  increases from 250 to 350 m a.g.l., suggesting that the model overestimation of mixing ratio may be sensitive to the  $h_{\text{ABL}}$  estimate (Fig. 4). Turner et al. (2003) report a dry bias of approximately five percent in their studies using the Vaisala RS80-H radiosonde (commonly used by NWS) with a general 5–10 percent difference in relative humidity measurements from a dual-launch of radiosondes. Miller et al. (1999) report a systematic dry bias in radiosonde measurements of relative humidity in comparison to both surface stations and aircraft measurements in the mixed layer. Thus, the model moist bias may be partly explained by a potential radiosonde measurement error.

The model overestimates scalar-average horizontal wind speed comparing against both Twin Otter and radiosonde measurements (Figs. 3 and 4), with an RMSE of 2–3 m s<sup>-1</sup>. Comparison versus the Harrow VHF wind profiler for 7 July, with a relative abundance of model-measurement comparison points, yields a similar RMSE but with an improved mean bias that suggests a slight model underestimation (Fig. 6). Thus, bias in the model estimation of horizontal wind speed remains uncertain, but at least some local overestimation is likely present. Limited surface measurements from the Twin Otter missed landings also support model overestimation (Table 3).

Model RMSE of wind direction versus radiosonde and wind profiler measurements shows much less variability than that of Twin Otter measurements. Model estimates reasonably capture the profile of wind direction versus Harrow measurements (Fig. 6) for both 7 July (Period 2) and Period 1. At both missed landings shown in Table 3, model estimated wind direction and METAR wind match very well, while Twin Otter measurements show noticeable departure.

Evaluating the model performance versus time (Fig. 5), both missed landings at KDET show a pronounced spike in Twin Otter measured temperature not captured in the model. This may be due to interpolation of near surface temperature from local skin surface temperature and lowest vertical layer air temperature, potentially missing microscale variation. Though limited in number, model estimates are closer to METAR temperature than are the Twin Otter measurements (Table 3). The Twin Otter measures a sharp spike in mixing ratio at the CYQG missed landing (10:10 UTC), but not at either KDET missed landing, (10:21, 10:50 UTC) and shows a substantial increase in water vapor mixing ratio to the northwest, all absent from the model estimates.



**Fig. 6.** Model verification versus height (a, b) and time (c, d) using VHF wind profiler measurements of horizontal wind speed and direction. The wind profiler is located at Harrow, ON (42° 42′ N 83° 28′ W). Model estimates are interpolated to observations which are hourly mean values for the 500 m bin up to the height specified. Each row shows the (bin-averaged) observed values (+) and model estimates (circles). Data from Period 1 (a, c) and Period 2 (b, d) are shown. The number of observations contributing to each bin is illustrated in the third column (row) of the top (bottom) row graphs.

Model performance of mixing ratio is strong versus METAR measurements at both the 10:10 and 10:50 missed landings (Table 3).

Model-estimated horizontal wind speed shows overestimation in time versus Twin Otter measurements except over the urban core of Detroit (roughly 10:14–10:17 UTC) near 520 m a.g.l. Twin Otter observations capture the wind speed decrease (increase) on the approach (take-off) of the missed landings more clearly than do model estimates. During the Flight #13 period, model-estimated and wind profiler-measured horizontal wind speed show strong coherence over the column (Fig. 6). Model performance of wind direction versus Twin Otter observations is erratic in time (Fig. 5), with smallest bias at the time of missed landings.

### 3.5 Summary of model verification

Comparison of model temperature estimates with Twin Otter flight measurements yields a distinct model cold bias of 2–3 K over approximately the lowest 500 m a.g.l. This bias may be influenced by a 1 K warm bias common to commercial aircraft temperature measurements. Conversely, model comparison to radiosonde measurements at KDTX reveals a warm bias of about 1 K in the corresponding vertical region and aloft with an RMSE of 2–4 K.

Twin Otter measurements of mixing ratio are consistently and significantly higher than both model estimates and METAR observations where overlap exists. The latter two sources show excellent correspondence during the Flight #13 missed landings. Comparison of model estimates to radiosonde measurements also yields small RMSE with no clear bias in the lowest 500 m a.g.l. A potential dry bias in radiosonde measurement may explain evidence of a moist model bias aloft during Period 2.

Model estimates of horizontal wind speed consistently overestimate both Twin Otter and radiosonde measurements with a mean bias of roughly  $1\text{--}2\text{ ms}^{-1}$  and RMSE of  $2\text{--}3\text{ ms}^{-1}$ , though better performance is found versus the VHF wind profiler. Verification within the ABL is limited here, but suggests that model estimates of horizontal wind speed are likely too strong (by approximately  $2\text{ ms}^{-1}$ ). Comparisons show no common model wind speed bias versus height or time, though model estimated  $h_{\text{ABL}}$  may be contributing to local wind, temperature or moisture biases. METAR and Twin Otter wind measurements correspond well during the missed landings. Model estimated wind direction adheres well to both radiosonde and profiler measurements with local error seldom exceeding 30 degrees. This result is particularly important for validating the penetration of lake-breeze fronts in this environment.

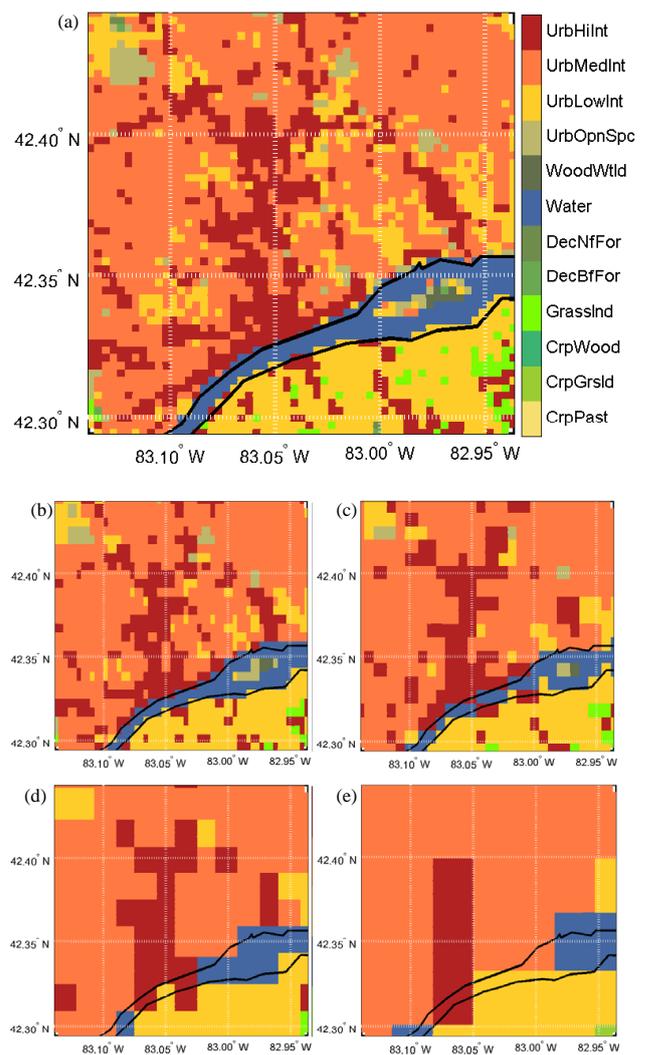
## 4 Results

### 4.1 Sensitivity of the morphology to changing surface cover resolution

This study hypothesizes sensitivity of mesoscale modeled urban meteorology to the scale of urban representation. This hypothesis presumes that the morphology of the urban environment changes with the scale of representation. Frequency distributions of urban land surface type reveal that nearly 20 percent more of the fourth grid of the model domain is classified as “medium intensity urban” in case 120 s than case 10 s (Fig. 7), resulting in change to the local and overall urban morphology accordingly (Table 1). Statistical assessment (coefficient of variation) of the principal morphology parameters ( $z_R$ ,  $f_{\text{URB}}$ , and  $R/R_W$ ) demonstrates a consistent loss of variability with decreasing resolution of the urban surface. This loss of variability is statistically significant (via 2 sample  $F$ -test) between all cases for the  $f_{\text{URB}}$  parameter, but only compared with case 60 s and 120 s for  $z_R$  and  $R/R_W$ . These results establish a need to diagnose the response of the local meteorology.

### 4.2 Quantifying the meteorological response

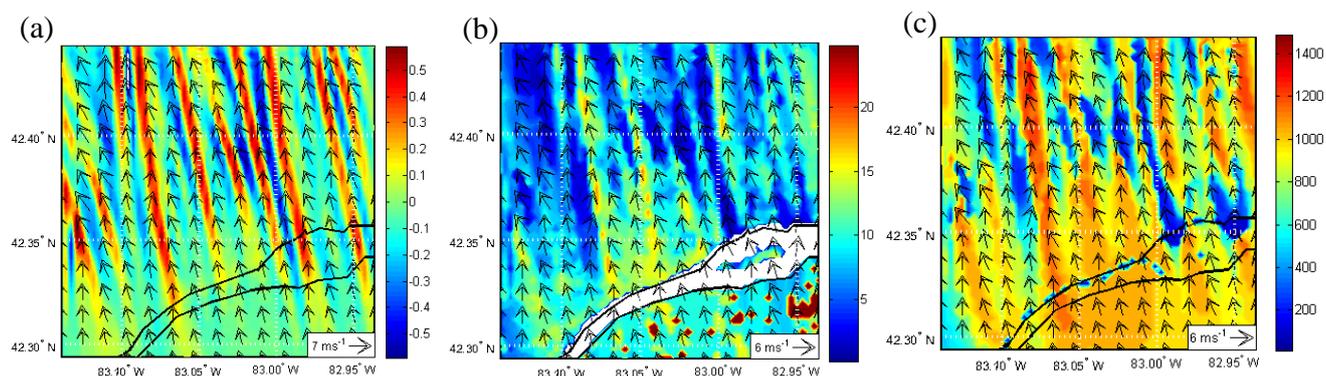
Analysis of the change in model meteorology over the urban core of Detroit-Windsor concentrates on two areas: the surface energy balance and the meteorology within and above the urban canopy, including static and dynamic stability, temperature, moisture, turbulence kinetic energy, horizontal and vertical winds and estimated boundary layer depth. The evaluation examines (1) change to the grid-average value of pertinent quantities, (2) sources of local change within the grid and (3) variation in time of the root-mean-squared-deviation (RMSD) of pertinent quantities between case studies. The latter assessment provides a sound estimate of the magnitude of change that can be anticipated as a result of using coarser mesoscale urban representation, effectively



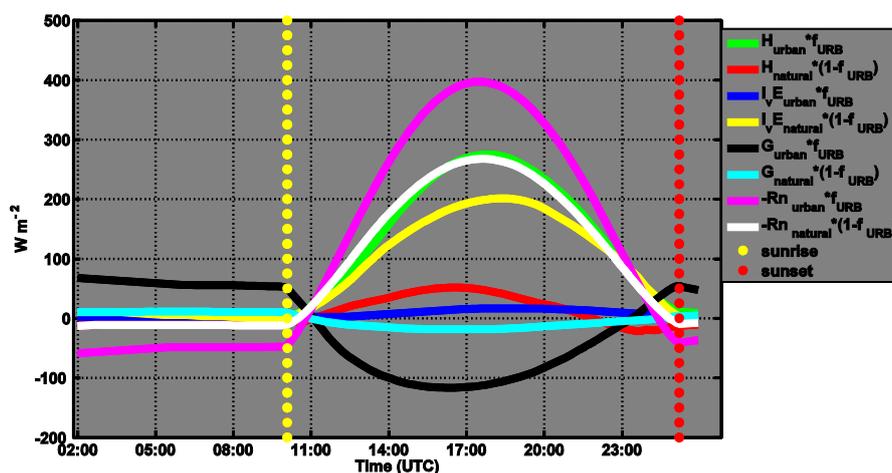
**Fig. 7.** Surface cover type over the fourth model grid of the Detroit-Windsor domain using 10 s (a), 20 s (b), 30 s (c), 60 s (d) and 120 s (e) surface cover resolution data. Color scheme in all sub-plots corresponds to that in (a). See Appendix A for translation of abbreviations in legend.

contributing a rough “error bar” to quantities of interest to mesoscale atmospheric modelers. The RMSD assessment includes comparisons of all case studies (10 s, 20 s, 30 s, 60 s, 120 s). The remaining assessments focus exclusively on the change from case 10 s to case 20 s to understand the significance of the neighborhood scale on urban meteorology and the magnitude of change resulting from a very small reduction in the scale of urban representation.

In conjunction with these case studies, model resolved structures are also examined for both periods of study. WRF simulations with well-mixed layers, horizontal resolution comparable to this study and sufficient stability ( $-z_i/L < 25$ ), where  $z_i$  is the depth of the well-mixed layer and  $L$  is the Obukhov length scale (Obukhov, 1946; Monin and



**Fig. 8.** Vertical velocity ( $\text{ms}^{-1}$ ) at the midpoint of the second lowest layer above the surface ( $\sim 91$  m a.g.l.) (a), a non-dimensional Obukhov stability parameter ( $-z/L$ ) (b) and ABL depth (m) (c), all evaluated over the 4th model grid in case 10 s at 18:20 UTC 24 June 2007. All figures show horizontal wind at the midpoint of the lowest model layer (except (a)) in black vectors, scaled by the reference vector at the lower right, each vector being separated by approximately four grid cells.



**Fig. 9.** Flux components of the average surface energy budget over the fourth model grid for case 10 s. Fluxes are shown versus time (UTC) for the Period 02Z 24 June – 01Z 25 June 2007 in units of  $\text{Wm}^{-2}$  for the components: urban surface sensible heat (green), natural surface sensible heat (red), urban surface latent heat (blue), natural surface latent heat (yellow), urban surface ground heat (black), natural surface ground heat (cyan), (*negative*) urban surface net radiation (pink) and (*negative*) natural surface net radiation (white). Approximate time of sunrise (sunset) is indicated by the yellow (red) dotted line.

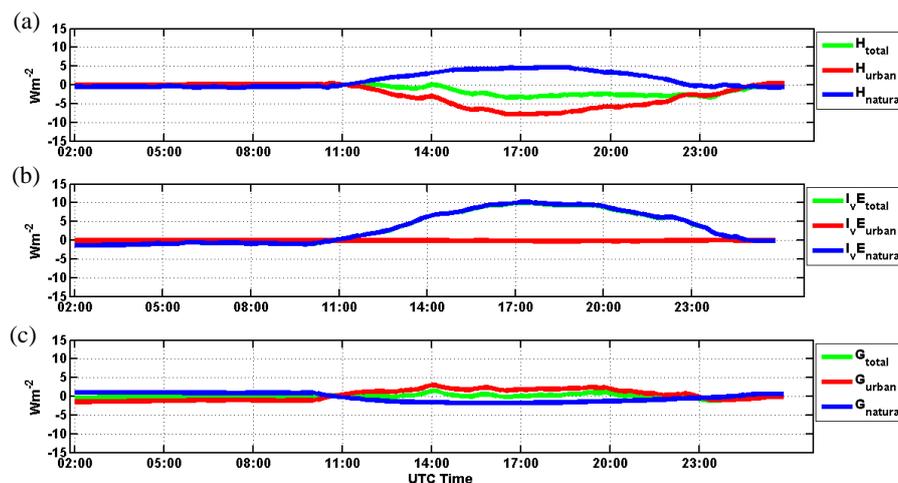
Obukhov, 1954), frequently generate horizontal convective rolls (HCR) (Trier et al., 2004; Miao and Chen, 2008; Gutiérrez et al., 2010; LeMone et al., 2010). Where these conditions are met, simulations here also demonstrate HCR presence (Fig. 8). The rolls shown in the example here are approximately 2.5 km in width, satisfying the observed 3:1 ratio of HCR width to well-mixed layer ABL depth (Stull, 1988) and also exceeding the minimum model effective resolution (see Sect. 2.2), though more thorough observations are needed for sufficient verification of this behavior.

The change in land cover resolution from case 10 s to case 20 s creates an abundance of model grid cells with changed urban land cover type (Fig. 7). With the presence of the Detroit River, this also includes the transition of cells from

urban to non-urban (including water) classification and vice versa. For grid-average values, a principal consequence of this change in land cover resolution is a slight shift in the overall distribution of urban land cover type toward higher urban intensities, masking some of the heterogeneity of the true urban surface.

### 4.3 Surface energy budget response

The surface energy budget for case 10 s (Fig. 9) illustrates the contribution of both the urban and natural surfaces to the local energy balance. A shift in grid-average urban intensity from case 10 s to case 20 s ( $\Delta_{\text{grid-average}} f_{\text{URB}} = +0.014$ ) perturbs this surface energy balance. One of the more



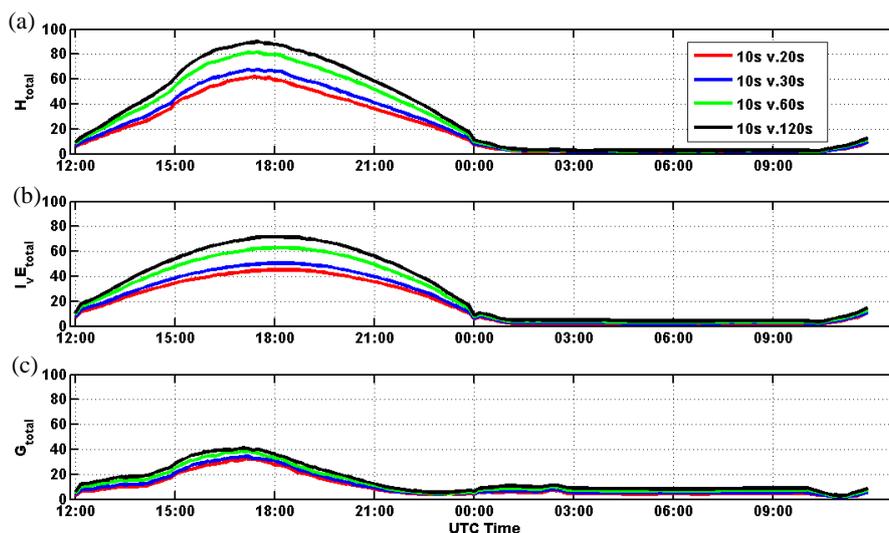
**Fig. 10.** Change of flux (case 10 s – case 20 s) for sensible heat flux (a), latent heat flux (b) and ground heat flux (c) including the total (green) urban (red) and natural surface (blue) contributions to each. Change shown is averaged over all grid cells in the fourth model grid of the domain, plotted versus time (UTC) for the Period 02Z 24 June – 02Z 25 June 2007 in units of  $\text{Wm}^{-2}$ .

conspicuous changes in the surface representation going from 10 s to 20 s resolution is the conversion of scattered, limited area natural surface class grid cells to urban grid cells south of the Detroit River over Windsor (Fig. 7). There are competing influences on urban canopy heat fluxes as a result of this change in grid-average  $f_{\text{URB}}$ . The immediate effect of a shift toward higher grid-average urban intensity is geometric: a taller canopy with increased building density, restricting canyon space. This reduces  $u_c$ , enhancing the bulk transfer (drag) coefficient for heat ( $C_H$ ) at the wall and road surfaces ( $C_H$  also increases at the roof). The net result favors enhanced sensible and latent flux from the urban canopy ( $l_v E_{\text{urban}}$ ,  $H_{\text{urban}}$ ). To restore equilibrium in the surface energy budget, however, the model iteratively reduces the skin surface temperature at the wall, road and roof surfaces, favoring a reduction of  $G_{\text{urban}}$ ,  $H_{\text{urban}}$ ,  $l_v E_{\text{urban}}$  and the outgoing (longwave) radiation. These urban fluxes are additionally sensitive to local temperature and moisture gradients. The net effect on the individual heat flux components is assessed below.

Among all surface energy budget components, the latent heat flux ( $l_v E_{\text{total}}$ ) demonstrates the most significant response between case 10 s and case 20 s (Fig. 10). The contribution from the urban component ( $l_v E_{\text{urban}} f_{\text{URB}}$ ) is minimal (due to limited moisture availability ( $\beta$ )), remaining below  $10 \text{ Wm}^{-2}$  at peak. Thus, the change in  $l_v E_{\text{total}}$  derives principally from the natural surface component of the grid cells ( $(1 - f_{\text{URB}}) l_v E_{\text{natural}}$ ) during the daytime when  $l_v E_{\text{natural}}$  is strongest. The change in  $f_{\text{URB}}$  contributes toward the bulk of the daytime decrease in  $l_v E_{\text{total}}$  with  $l_v E_{\text{natural}}$  responsible for the remainder. The latent heat flux from a vegetation-covered surface here derives mostly from canopy evapotranspiration, parameterized by the Penman-

Monteith relation (Monteith, 1981). The grid-average contributions to available energy changes little between cases; the change in  $l_v E_{\text{natural}}$  derives largely from the water vapor demand at the lowest model layer ( $\sim 28 \text{ m a.g.l.}$ ), which varies locally. The RMSD of  $l_v E_{\text{total}}$  (Fig. 11) over the urban core peaks at  $45 \text{ Wm}^{-2}$  at 18:00 UTC (14:00 LT), coincident with the time of the strongest flux (Fig. 9) and nearly 25 percent of its value. RMSD increases monotonically, in phase, for case 10 s versus progressively coarser cases, approaching 35 percent of the total flux value for case 10 s vs. case 120 s. This demonstrates significant daytime sensitivity of model estimated  $l_v E_{\text{total}}$  to the scale of urban representation and the potential gain from use of the neighborhood scale (case 10 s) in urban surface representation. It also suggests that much coarser representations yield only a marginal increase in RMSD from the neighborhood scale.

The response of the surface sensible heat flux ( $H_{\text{total}}$ ) to the land cover resolution change entails contributions from both the urban ( $H_{\text{urban}}$ ) and natural surface ( $H_{\text{natural}}$ ) components. Daytime grid-average  $H_{\text{total}}$  increases from case 10 s to case 20 s, the sum of an increase from  $H_{\text{urban}} f_{\text{URB}}$  and a decrease from  $H_{\text{natural}} (1 - f_{\text{URB}})$  (Fig. 10). The net increase in  $f_{\text{URB}}$  reduces the proportion of total flux from natural surfaces contributing partly toward the early afternoon reduction of  $H_{\text{natural}} (1 - f_{\text{URB}})$ .  $H_{\text{natural}}$  itself also decreases due to the reduced daytime natural surface skin temperature, shrinking the local natural skin surface-to-2 m temperature gradient and, hence, the flux. While the grid-average contribution of  $H_{\text{urban}} f_{\text{URB}}$  to  $H_{\text{total}}$  is positive, grid-average change to  $H_{\text{urban}}$  itself is negative. The skin surface temperature reduction along the canopy roof, walls and road grows to 0.5 K by mid-afternoon, with diagnostic canyon air temperature ( $T_c$ ) decreasing by approximately half that. Additionally, the shift



**Fig. 11.** RMSD of selected surface heat flux quantities over the fourth model grid for comparison of case 10 s and others of differing land cover resolution (in arc-seconds), averaged over all available data in Period 1 and Period 2. RMSD is shown versus time of day (UTC time) in units of  $\text{Wm}^{-2}$  for total surface sensible heat flux (a), total surface latent heat flux (b) and total ground heat flux (c).

toward higher urban intensity favors greater building density, at the expense of canyon width. In the afternoons, the peak temperature difference between the roof surface and the air above the canopy ( $\sim +6$  K) is considerably smaller than that between the canyon wall or road surfaces and the canyon air temperature ( $\sim +9$  K,  $+12$  K, respectively), not shown here. Combined, these changes reduce grid-average  $H_{\text{urban}}$  by approximately  $8 \text{ Wm}^{-2}$  by mid-afternoon from case 10 s to case 20 s. Despite the grid-average reduction of  $H_{\text{urban}}$  the grid-average increase of  $f_{\text{URB}}$  forces a net increase in grid-average  $H_{\text{urban}} f_{\text{URB}}$ . Accounting for those grid cells that change from urban to non-urban classification and vice versa (such as by consequence of resolution of the Detroit River), this further increases  $H_{\text{urban}} f_{\text{URB}}$ , resulting in a net increase of approximately  $10 \text{ Wm}^{-2}$  in mid-afternoon, a four percent enhancement of its original contribution in case 10 s (Fig. 9).

The RMSD of  $H_{\text{total}}$  (Fig. 11) over the urban core peaks at  $62 \text{ Wm}^{-2}$  around 17:30 UTC (13:30 LT), coincident with the time of the strongest  $H_{\text{urban}} f_{\text{URB}}$  (Fig. 9) and 18 percent of  $H_{\text{total}}$ . As with  $l_v E_{\text{total}}$ , RMSD increases monotonically, in phase, for case 10 s versus progressively coarser cases, approaching 27 percent of the total flux value for case 10 s vs. case 120 s, further demonstrating significant local sensitivity.

Grid-average change to ground heat flux ( $G_{\text{total}}$ ) from case 10 s to 20 s is virtually negligible (Fig. 10), but is the result of opposing change in the urban ( $G_{\text{urban}} f_{\text{URB}}$ ) and natural surface contributions ( $G_{\text{natural}}(1 - f_{\text{URB}})$ ) that can result in more substantial changes locally. The  $G_{\text{natural}}(1 - f_{\text{URB}})$  contribution registers a grid-average decrease in magnitude up to  $2 \text{ Wm}^{-2}$  (both day and night). As with sensible heat flux, this decrease is a result of reduction to both  $(1 - f_{\text{URB}})$  and

$G_{\text{natural}}$ . The decreased daytime natural surface skin temperature is nearly balanced by increased nocturnal temperature, reducing the local temperature gradient across the natural skin surface and, thus,  $G_{\text{natural}}$ . Increased grid-average  $f_{\text{URB}}$  at case 20 s increases building density and thus favors weighting rooftop “ground” heat flux more heavily than road “ground” heat flux. This change favors decreased daytime ground heat flux ( $\sim 2\text{--}3 \text{ Wm}^{-2}$ ) and slightly increased nighttime flux. The contribution to total ground heat flux,  $G_{\text{urban}} f_{\text{URB}}$ , shows a net increase in magnitude ( $2\text{--}3 \text{ Wm}^{-2}$  during the afternoon,  $1 \text{ Wm}^{-2}$  at night), due to increased grid-average  $f_{\text{URB}}$ .

The RMSD of  $G_{\text{total}}$  (Fig. 11) over the urban core peaks at  $32 \text{ Wm}^{-2}$  around 17:00 UTC (13:00 LT), coincident with the time of its strongest magnitude (Fig. 9) and 24 percent of  $G_{\text{total}}$ . RMSD increases for case 10 s versus progressively coarser cases, but with proportionally smaller increments than  $H_{\text{total}}$  or  $l_v E_{\text{total}}$ , approaching 30 percent of the total flux value for case 10 s vs. case 120 s.

#### 4.4 Meteorological response

The daytime skin surface temperature of the urban solid surfaces (roof, wall, road) peaks around 10 K higher than the natural surface in this study, preceding peak air temperature above the canopy ( $\sim 22:00$  UTC) by about 4 h (not shown). Consequently, the increased urbanization in case 20 s versus case 10 s ( $\Delta$  grid-average  $f_{\text{URB}} = +0.014$ ) increases the grid-average skin surface temperature by up to 0.2 K. This result confirms expectations of increased surface (skin) temperature associated with increased urban intensity. The natural skin surface temperature incurs little change except where

grid cells are reassigned from land to water cover or vice-versa as a result of resolution of the Detroit River.

Within the urban canyon, the model estimated air temperature ( $T_c$ ) scalar wind speed ( $u_c$ ) and water vapor mixing ratio ( $q_c$ ) are subject to variation in canyon geometry and heat flux. Comparing case 10 s and case 20 s, the increased ratio of  $R/R_W$  and slight daytime (nighttime) decrease (increase) of surface skin temperature along the canyon walls and road in case 20 s decrease grid-average  $T_c$  up to 0.2 K in the afternoon and increase up to 0.1 K overnight. The  $u_c$  quantity demonstrates a slight grid-average reduction (less than  $0.1 \text{ ms}^{-1}$ ). This is anticipated due to reduced mean canyon space at higher urban intensity. The grid-average  $q_c$  shows little change. Local response in canyon meteorology is more substantial, vulnerable to change in the above-canopy wind speed and local canopy height. Versus case 20 s, the peak of  $T_c$ ,  $u_c$  and  $q_c$  RMSD (Fig. 12) is approximately 0.3 K,  $0.2 \text{ ms}^{-1}$  and  $0.2 \text{ g kg}^{-1}$ , respectively. Normalized by the mean,  $u_c$  RMSD is greatest, though more precise diagnosis of street canyon flow requires more explicit resolution as in a computational fluid dynamics model. RMSD increases consistently for comparison of case 10 s versus progressively coarser resolution test cases, though evening change in  $q_c$  shows some variability.

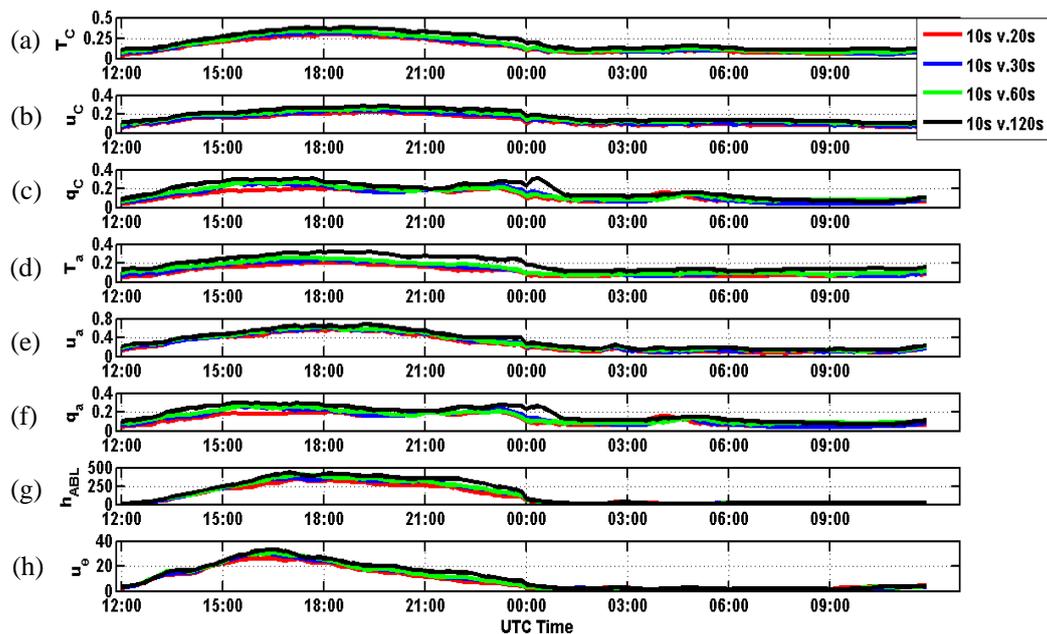
Above the canopy, there is also evidence of a response in the meteorology. Examining the sign of  $L$ , the static stability of the urban environment in these case studies shows a consistently unstable daytime surface layer after sunrise. A largely stable nighttime surface layer develops abruptly after sunset. Being a function of surface heat flux, the transition of  $L$  from daytime static instability to nighttime static stability is non-uniform and progresses inversely to the urban intensity. For Periods 1 and 2, (sunset  $\sim 01:12$  UTC) most developed, open space type urban land cover surfaces become statically stable within 30 minutes of 23:00 UTC, low intensity urban  $\sim 23:50$  UTC, medium intensity urban  $\sim 00:30$  UTC and high intensity urban  $\sim 01:30$  UTC. Low-level wind speed remains generally  $\leq 3 \text{ ms}^{-1}$  across the grid. Model estimates reveal limited, sporadic areas of static instability overnight over the high intensity urban surfaces, otherwise vacillating between weak and strong static stability. Around the time of sunrise ( $\sim 10:00$  UTC), high intensity urban surface transition to static instability precedes the rest of the domain by about 30 min. The remaining urban surface types change between 10:40 and 11:00 UTC. Thus, local change in urban surface classification at some coarser representation may drastically alter the overlying model estimated static stability. This result is keenly pertinent to model applications sensitive to surface layer vertical mixing in the evenings and overnight. Assessment of the local dynamic stability by way of the bulk Richardson number ( $Ri_b$ ; Richardson, 1920) clearly distinguishes the dynamically unstable daytime well-mixed ABL from the laminar flow above and also reveals some difference in the evening residual turbulence strength between days during Period 1. Changes in the surface representation from case

10 s to case 20 s provoke a patchwork of positive and negative change, mostly above 100 m a.g.l., but not enough to alter the flow classification.

Air temperature above the canopy responds to the change in  $T_s$  due to changing scale of surface representation. The phase shift in peak sensible heat flux between the urban canopy and natural surfaces (Fig. 9) suggests that change in  $f_{\text{URB}}$  will affect the timing of the peak total sensible heat flux and, hence, the air temperature, contributing to the peak seen in Fig. 12a and d. Predictably, re-classification of urban grid cells to water grid cells from case 10 s to 20 s dominates the latter, given a typical 15–20 K  $T_s$  difference in the afternoons. Wind direction subsequently influences the breadth of this effect. On the afternoon of 23 June, low-level easterly wind favors more substantial cold air advection resulting from increased water coverage in case 20 s, not found on 24 June (south-southeast winds) or 7 July (west-southwest winds). Later that day, after 21:00 UTC, a Lake Erie lake breeze front (LBF) penetrates the domain from the south-southwest. The exchange of medium intensity urban land grid cells for water grid cells along the eastern part of the Detroit River in case 20 s versus case 10 s (Fig. 7) delays the advance of the LBF, as shown by the black-dashed highlighted region of Fig. 13. In contrast, the replacement of water grid cells with high intensity urban classification in case 60 s advances the LBF penetration by 1–2 km versus case 20 s (green-dashed highlighted region in Fig. 13), more closely emulating the local LBF representation in case 10 s. Some local LBF acceleration and deceleration caused by changed urban intensity are also evident across the grid when comparing case 10 s, 20 s and 60 s. The purple-dashed highlighted region of Fig. 13 shows how scattered areas of high intensity urban surfaces in case 10 s and 20 s (Fig. 7) accelerate the local LBF penetration versus case 60 s where only low intensity urban surfaces are found. Coastline resolution to the east of Windsor also affects the placement of a thermal internal boundary layer on 24 June. As the synoptic-scale wind rotates from south to southeast during the day, the fetch incorporates a progressively longer Period over the cooler Lake St. Clair surface prior to reaching eastern Detroit. Its expansion into the urban core region is accelerated in case 20 s versus case 10 s, providing up to a 1.5 K difference locally in air temperature above the canopy ( $T_a \sim 28$  m a.g.l.) between cases.

The RMSD of  $T_a$  peaks at 0.2 K in the early afternoon (Fig. 12) for case 10 s vs. 20 s, slightly less than RMSD of  $T_c$ . Comparing case 10 s to coarser resolutions, RMSD of air temperature shows only modest increases. Air temperature above the urban canopy ( $T_a$ ) and higher in the ABL appears relatively insensitive to systematic change in the urban morphology except in local circumstances as described above.

The effect of changed surface representation has a dichotomous effect on TKE. Increased urbanization at case 20 s leads to a net increase in mean canopy height, promoting mechanical production of turbulence and resulting in a net



**Fig. 12.** RMSD of selected meteorological quantities over the fourth model grid for comparison of case 10 s and others of differing land cover resolution (in arc-seconds), averaged over all available data in Period 1 and Period 2. RMSD is shown versus time of day (UTC time) in units of K for (a) canyon temperature ( $T_c$ ),  $\text{ms}^{-1}$  for (b) canyon wind speed ( $u_c$ ) and  $\text{g kg}^{-1}$  for (c) canyon water vapor mixing ratio ( $q_c$ ), K for (d) lowest model layer ( $\sim 28$  m a.g.l.) temperature ( $T_a$ ),  $\text{ms}^{-1}$  for (e) lowest model layer wind speed ( $u_a$ ),  $\text{g kg}^{-1}$  for (f) lowest model layer water vapor mixing ratio ( $q_a$ ), m for (g) boundary layer depth ( $h_{\text{ABL}}$ ) and degrees for (h) lowest model layer wind direction ( $u_\theta$ ).

gain in grid-average TKE near the surface. When the wind direction and strength favors advection of the daytime grid-average cooling influence of the increased water coverage in case 20 s, the grid-average cooler surface slightly weakens the strength of thermal plume updrafts and downdrafts, concurrently reducing TKE aloft within the boundary layer and thus slightly reducing grid-average model estimated  $h_{\text{ABL}}$ , parameterized according to TKE strength (Janjic, 2002).

Locally, as the buoyant production of TKE in the ABL varies according to change in surface thermal properties, and shifting wind direction varies TKE strength, so does the model-estimated  $h_{\text{ABL}}$  also vary. The RMSD of  $h_{\text{ABL}}$  reveals considerable variability during the daytime, peaking above 300 m in the early afternoon (Fig. 12). Comparing case 10 s versus progressively coarser urban surface representations yields RMSD exceeding 400 m.

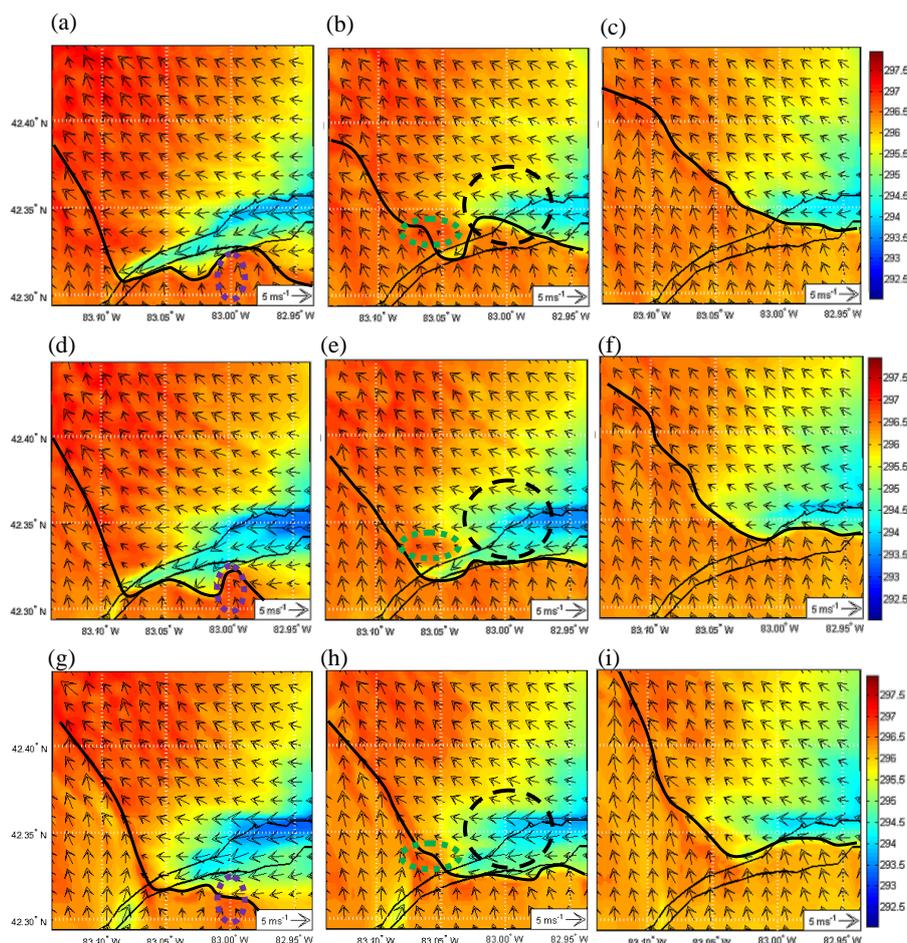
The variation of  $q$  with surface representation follows the change in  $h_{\text{ABL}}$ . Reduction of grid-average  $h_{\text{ABL}}$  at case 20 s reduces dry air entrainment from aloft and leads to a grid-average net increase of  $q$  (up to  $0.1 \text{ g kg}^{-1}$ ) in the well-mixed layer during the afternoon. RMSD of  $q_a$  peaks at  $0.2 \text{ g kg}^{-1}$  in the afternoon versus case 20 s, expanding up to  $0.3 \text{ g kg}^{-1}$  versus case 120 s (Fig. 12).

With considerable variation in wind direction among Periods 1 and 2, the low-level (above-canopy) horizontal wind speed RMSD peaks between  $0.5\text{--}0.7 \text{ ms}^{-1}$  during the afternoon for comparison of the neighborhood scale to coarser

scales (Fig. 12). Corresponding wind direction RMSD peaks in the early afternoon during ABL growth, reaching 25 degrees for comparison versus case 20 s and up to 35 degrees for case 120 s. This sensitivity is of particular interest to the Detroit-Windsor metropolitan area, where such deviation can affect the timing and extent of influence of on-shore flow or LBF penetration.

## 5 Conclusions

The sensitivity of model mesoscale meteorology to the scale of representation of the urban surface is explored over several summer periods in the Detroit-Windsor metropolitan area. The response includes both periodic change (as a function of daily heating) and stochastic change (as from change in the direction and magnitude of low-level flow in response to varying surface representation). The “effective model” resolution of approximately 2.1 km in the finest grid inhibits explicit inter-case comparison of the fine scale structure that would be expected to develop in response to a changing surface morphology; the model dampens this part of the KE spectrum and with it the variance of sensitivity to the surface representation. However, the surface energy budget and other near-surface meteorological quantities forced largely by the surface parameterizations can be expected to show demonstrable sensitivity to change in the surface representation.



**Fig. 13.** Temperature (K), at the lowest model layer ( $\sim 28$  m a.g.l.) over the fourth model grid of the domain at 22:10 (**a, d, g**), 22:50 (**b, e, h**) 23:20 UTC (**c, f, i**) 23 June 2007 for case 10 s (**a–c**), case 20 s (**d–f**) and case 60 s (**g–i**). Horizontal wind speed for each case at this height is shown in vectors scaled by the reference vector at the lower right. The estimated position of the lake breeze front is indicated by the thick black contour. The dashed ovals highlight particular examples of discrepancy in lake breeze front position between cases and are discussed further in the text.

In the surface energy budget, the natural surface component of the total latent heat flux ( $l_v E_{\text{natural}} (1 - f_{\text{URB}})$ ) and the urban surface component of the total sensible heat flux ( $H_{\text{urban}} f_{\text{URB}}$ ) are most sensitive, showing a net grid-average daytime decrease and increase, respectively, of up to approximately  $10 \text{ W m}^{-2}$  for change from a 10 to 20 arc-second resolution of the surface. Local change in urban classification as a consequence of scale change yields RMSDs of 20–30 percent of the total heat flux, demonstrating a considerable change in local surface energy balance within the urban core for a relatively small change in surface resolution. The fractional urban coverage ( $f_{\text{URB}}$ ) parameter, which determines the extent of vegetation cover, contributes substantially to this sensitivity in the model, as anticipated from recent studies.

In the absence of explicit resolution of flow in the urban boundary layer, there is potential benefit to the neighborhood scale of resolution of the urban environment with respect to boundary layer depth estimation and in the timing of lake-breeze frontal passages or thermal internal boundary layers. High urban intensity, as found in the urban core of major cities, is found to delay the onset of nocturnal static stability at the surface up to 2–3 h versus non-urban surfaces. Increased urban intensity enhances mechanical production of turbulence kinetic energy just above the canopy, but has little influence of model estimated boundary layer depth. Afternoon estimated boundary layer depth RMSD versus the neighborhood scale exceeds 300 m, demonstrating significant sensitivity. Scale of representation is also critical to cities with riparian or coastal interests, where temperature, turbulence kinetic energy and boundary layer depth are highly sensitive. For numerical weather

prediction applications, this surface resolution increase from 20 s ( $\sim 617$  m) to 10 s ( $\sim 308$  m) under fair weather conditions provokes areas of conspicuous change scattered across the domain, with particular relevance to important mesoscale features such as the lake breeze circulation.

Modelers should be cognizant of the inherent error in state variable estimates evolving from a mesoscale urban surface parameterization. This study offers one attempt to quantify the nature and magnitude of sensitivity to scale and the potential error that arises with progressively coarser representations. Although the most acute response predictably corresponds to surface and low-level quantities, change in boundary layer depth and the timing of mesoscale circulations like lake-breeze fronts can yield broader impacts on real atmosphere simulations.

## Appendix A

### Symbols, acronyms and abbreviations

ABL	Atmospheric Boundary Layer	km	kilometer
ACARS	Aircraft Communications Addressing and Reporting System	K	Kelvin
a.g.l.	Above Ground Level	$l_v$	latent heat of vaporization
AMDAR	Aircraft Meteorological Data Acquisition and Relay	$l_v E$	latent heat flux
AWIP	NCEP Eta/NAM 212 grid model analysis	$l_v E_{\text{natural}}$	latent heat from the natural component of an urbanized grid cell
BAQS-Met	Border Air Quality and Meteorology field campaign	$l_v E_{\text{total}}$	latent heat flux from the $l_v E_{\text{urban}}$ and $l_v E_{\text{natural}}$ components of a grid cell
$C_H$	bulk transfer coefficient for heat	$l_v E_{\text{urban}}$	latent heat flux from the urban canopy
CrpGrslnd	mixed cropland and grassland land surface type	$L$	Obukhov length scale
CrpPast	mixed cropland and pasture land surface type	LBF	Lake Breeze Front
CrpWood	mixed cropland and woodland land surface type	LES	Large Eddy Simulation
CFD	Computational Fluid Dynamics	LSM	Land Surface Model
CRC	(NOAA) Coastal Resources Center	m	meter
DecBfFor	deciduous broadleaf forest land surface type	MHz	MegaHertz
DecNfFor	deciduous needleleaf Forest land surface type	MxIrgCpP	mixed dry and irrigated cropland and pasture land surface type
DNS	Direct Numerical Simulation	METAR	aviation routine weather report
DTW	Detroit-Windsor	MYJ	Mellor-Yamada-Janjic
$E$	kinematic moisture flux ( $l_v E =$ latent heat flux)	MNR	Ministry of Natural Resources
$f_{\text{URB}}$	fractional urban coverage	NOAA	National Oceanic and Atmospheric Administration
g	gram	NCEP	National Centers for Environmental Prediction
$G$	ground heat flux	NLCD	National Land Cover Dataset
$G_{\text{natural}}$	ground heat from the natural component of an urbanized grid cell	NRC	National Research Council
$G_{\text{total}}$	ground heat flux from the $G_{\text{urban}}$ and $G_{\text{natural}}$ components of a grid cell	NWP	Numerical Weather Prediction
$G_{\text{urban}}$	ground heat flux from the urban canopy	NWS	National Weather Service
Grasslnd	grassland land surface type	ON	Ontario
GPS	Global Positioning System	$p$	pressure
$h$	normalized building height	Pa	Pascal
$h_{\text{ABL}}$	atmospheric boundary layer depth	$q$	water vapor mixing ratio/component of turbulence kinetic energy
hPa	hecto-Pascal	$q_a$	water vapor mixing ratio at the mid-point of the lowest model layer
$H$	sensible heat flux	$q_c$	urban canyon water vapor mixing ratio
$H_{\text{natural}}$	sensible heat from the natural component of an urbanized grid cell	$R$	normalized building width
$H_{\text{total}}$	sensible heat flux from the $H_{\text{urban}}$ and $H_{\text{natural}}$ components of a grid cell	$Ri_b$	bulk Richardson number
$H_{\text{urban}}$	sensible heat flux from the urban canopy	RANS	Reynolds Averaged Navier Stokes equations
Hz	Hertz	RMSD	Root-Mean-Squared Deviation
IrgCrpPst	irrigated cropland and pasture land surface type	RMSE	Room Mean Squared Error
JJA	June–July–August	$R_W$	normalized street width
kg	kilogram	s	second
		$T$	temperature
		$T_a$	air temperature at the mid-point of the lowest model layer
		$T_c$	urban canyon air temperature
		$T_s$	skin surface temperature
		TKE	Turbulence Kinetic Energy
		$u_a$	horizontal wind speed at the mid-point of the lowest model layer
		$u_c$	urban canopy wind speed
		$u$	(scalar) wind speed
		$u_\theta$	wind direction
		UCM	Urban Canopy Model
		UrbHint	developed, high intensity urban land surface type
		UrbLint	developed, low intensity urban land surface type
		UrbMint	developed, medium intensity urban land surface type
		UrbOsp	developed, open space urban land surface type
		USGS	United States Geological Survey
		UTC	Universal Coordinated Time
		VHF	Very High Frequency
		W	Watt
		WRF	Weather Research and Forecasting model
		WRF-ARW	Advanced Research WRF
		$x$	model-estimated variable
		$\hat{x}$	model-estimated variable interpolated to observation space
		$y$	observed variable
		$z_R$	mean canopy height
		$\beta$	moisture availability
		$\Delta x$	grid cell width
		$^\circ$	degree

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