An Evapotranspiration-Interception Model for Urban Areas

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A model to calculate evapotranspiration from urban areas over a wide range of meteorological conditions is presented. An evapotranspiration-interception approach is used because it is necessary to cope with the changing water availability on the surface, during and following rainfall or irrigation. The model is applicable to areas ranging from the size of city blocks to land use zones and time periods of one hour and longer. The modeled evaporation is compared with that from micrometeorological measurements conducted from January to June 1987 in a suburb of Vancouver, British Columbia, Canada. The results show that this approach to modeling urban evapotranspiration provides realistic hourly and daily estimates of the areally averaged latent heat flux and surface water state.

1. INTRODUCTION

Evapotranspiration (E), the mass equivalent of the latent heat energy flux, is the term that links the energy and the water balances. For urban areas the water balance is written

$$P + I + F = E + r + \Delta S + \Delta A \quad \text{mm hr}^{-1} \quad (1)$$

where P is precipitation, I is piped water supply, F is water released due to anthropogenic activities, r is runoff, ΔS is the change in water storage for the period of interest, and ΔA is net moisture advection; the urban energy balance is written

$$Q^* + Q_F = Q_E + Q_H + \Delta Q_S + \Delta Q_A \quad \text{W m}^{-2} \quad (2)$$

where Q^* is net all-wave radiation, Q_F is the energy released due to anthropogenic activities, Q_H is the sensible heat flux, ΔQ_S is the storage heat flux, and ΔQ_A is the net heat advection; $Q_E = L_v E$ where L_v is the latent heat of vaporization. These balances apply to the top of a volume which extends to sufficient depth that vertical heat and water exchange is negligible. Fluxes are determined per unit area of the top of the volume. A fuller explanation of this concept is given by Oke [1988].

Evaporation from urban areas has been assumed to be considerably less than that from neighboring rural areas because of the supposed contrast between the hydrologic properties of building materials and vegetation-covered soils [e.g., Chandler, 1976]. Recent work by Kalanda *et al.* [1980], Cleugh and Oke [1986], and Grimmond and Oke [1986] shows that evaporation has a larger magnitude than originally thought, for example, in a temperate city (Vancouver, British Columbia (B.C.)) evaporation has been shown to constitute 38% of the losses of the annual external water balance and 81% of the losses of the summer water balance [Grimmond and Oke, 1986].

Urban evaporation has received little attention in the fields of both urban climatology and urban hydrology. Indeed, it hardly rates mention in textbooks on the subject [e.g., Lazaro, 1979; Landsberg, 1981; Hall, 1984]. In most urban

hydrologic work, evapotranspiration is either ignored or dealt with via evaporation pan data [e.g., Alley *et al.*, 1980; Wenzell and Voorhees, 1980; Sman *et al.*, 1988] so that van den Ven [1988] concludes that the weakest point in the study of the urban water balance remains the estimation of evapotranspiration.

A model for use in conjunction with available runoff models to determine continuous hourly evapotranspiration would be useful to model water quantity, water quality, and urban climate. For water quantity it is of interest to be able to predict the surface water storage status. A recent trend in urban runoff work favors continuous simulation rather than modeling the runoff from individual rainfall events. Between-event simulation makes it necessary to account not only for the runoff but also for the other components of the water balance, including evaporation. For water quality modeling it is necessary to know the volumes of water present in order to calculate pollutant concentrations. In urban climatology there is a greater awareness of the evaporative term because of its role in the amelioration of thermal climate, even so there are only a few studies.

Models to determine the evapotranspiration from urban areas can be divided into two groups. First, there are those which consider Q_E as one flux in the total surface energy balance. These are one-, two-, and quasi-three-dimensional numerical boundary layer models. The convective Q_H and Q_E fluxes are often partitioned using a surface moisture availability factor or an assumed Bowen ratio (β). After attempting to validate three such urban climate models against measured energy balance fluxes (for dry summertime conditions), Ross and Oke [1988] conclude that Q_E is the poorest of the fluxes simulated. The second group includes simple statistical algorithms and physically based models utilizing hydrometeorological data as input.

The objective of this paper is to present a physically based model to estimate hourly, and longer-period, evapotranspiration associated with urban units ranging in size from city blocks to land use zones.

2. THE MODEL

If evapotranspiration is to be calculated under diverse meteorological conditions, it is necessary for a model to cope with changing water availability on the surface during and following rainfall. Further, since the physical structure of the city has been compared to that of a forest with its

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Fig. 1. Schematic of the conceptual framework of the model.

canopy, an evapotranspiration-interception approach similar to that used for forests is adopted. The urban canopy layer consists of the air contained between the buildings and trees. We propose an appropriate framework for urban evapotranspiration to be the Penman-Monteith-Rutter-Shuttleworth evapotranspiration-interception model which was originally developed for forests [Penman, 1948; Monteith, 1965; Rutter *et al.*, 1971; Shuttleworth, 1978]. It is the most successful, rigorous, robust, physically based evapotranspiration-interception model currently available [Gash, 1979; Shuttleworth, 1983, 1989]. In essence, the model calculates a running water balance of the "canopy" and "trunks." It requires inputs of hourly rainfall and meteorological parameters and provides outputs of throughfall, stemflow, and evaporation of intercepted water. Evaporation is calculated from the Penman-Monteith equation. The model allows for a continuous treatment of surface resistance for the transition between wet and dry surfaces.

The conceptual framework of this model, as adapted for urban areas, is shown in Figure 1. The following is an outline of the model and the adaptations incorporated so that it can be applied to urban areas.

The process of evapotranspiration from surfaces which have some vegetative cover can be considered to consist of three stages: (1) evaporation from a totally wet surface (due to intercepted water), (2) evapotranspiration from a partially wet surface, and (3) transpiration from a dry surface (water loss from outwardly dry vegetation via the stoma). To calculate E at any time it is necessary to know the surface water state to determine which stage is applicable. The Rutter model can be used to calculate the state of the running water balance of the canopy (C), summarized by the continuity equation

$$\frac{dC}{dt} = P(1 - T_F - T_S) - D - E \quad \text{mm hr}^{-1} \quad (3)$$

where t is time, T_F is the throughfall or proportion of rain falling directly to the ground through the gaps in the canopy, T_S is the proportion of rain diverted to the "trunks," and D

is the drainage rate. In the original model the canopy is represented as a single-layer store of moisture filled by incoming rainfall. It is capable of holding a preset amount of water S and drains at a rate D expressed as an empirical function in proportion to the amount of water in the store. Throughfall represents water not available for evaporation from the canopy. Subsidiary evaporation may arise from trunks wetted by stemflow.

Adapting this to the urban environment, the canopy is treated as a single-layer moisture store, with parallel stores which allow for the range of different surface types found in urban areas. As a first approximation, the urban system consists of two surface types: built/impervious and vegetated. There is little relevance to the concept of throughfall for impervious surfaces (buildings, paved road, paths), and since urban trees usually have vegetation (grass) below, the water which falls between them is caught by the vegetation below. Therefore throughfall can be set to zero or a very small number for both the vegetated and built surface types.

In urban areas the subsidiary loss, due to "stemflow", from wetted trunks can be interpreted as that from walls of buildings and from trunks of the tall vegetation. Generally, walls are not wetted by stemflow from the roof because of roof guttering. It is possible for them to be wetted directly by driving rain, but they are not extensively wetted under normal rain [Lacy, 1977]. Further, since the surface area of actual tree trunks in the urban system is not large [Grimmond, 1988], urban stemflow is also set to zero. The piped water supply (I) is an additional source of water to wet the urban canopy. Therefore by neglecting T_F and T_S but adding I the model can be reformulated for urban areas to read

$$\frac{dC_i}{dt} = (P + I_i) - D_i - E \quad (4)$$

where subscript i is the i th surface type. In this study, six surface types are used to characterize the study area: paved, built, coniferous, deciduous, irrigated grass, and unirrigated grass. A running water balance is maintained for each surface, and the evaporative flux calculated for an individual

TABLE 1. Hourly Input Data Requirements and Outputs Generated by the Model

	Units
<i>Input</i>	
Rainfall (P)	mm hr ⁻¹
Net radiation (Q^*)	W m ⁻²
Wind speed (u)	m s ⁻¹
Wind direction (φ)	deg, rad
Standard deviation of φ (σ_φ)	deg, rad
Air temperature (T_d)	°C
Wet-bulb temperature (T_w)	°C
or relative humidity	%
Pressure (p)	Pa
Sensible heat flux (Q_H) or temperature difference (ΔT_d)	W m ²
External water use (wu)	mm hr ⁻¹
Leaf area index (LAI)	
Soil moisture deficit ($\delta\theta$)	mm
Storage heat flux (ΔQ_S)	W m ⁻²
Anthropogenic heat flux (Q_F)	W m ⁻²
<i>Output</i>	
Latent heat flux (Q_E)	W m ⁻²
Evapotranspiration (E)	mm hr ⁻¹
Cumulative evapotranspiration	mm
Drainage (D)	mm hr ⁻¹
Surface state*	mm
Surface storage change	mm hr ⁻¹
Aerodynamic resistance (r_a)	s m ⁻¹
Surface resistances (r_s)	s m ⁻¹

*For total area and each surface type.

hour is weighted for the abundance of the i types occurring in the source area of the measurements (see section 3.1). The change in storage for the whole system is determined from the summation of all the surface types.

If it is assumed that the components of the urban surface are exposed to the same local scale climate, then a single-source (layer) model can be used to determine the latent heat flux (Q_E). The best tested approach is the *Monteith* [1965] version of the Penman equation [Stewart, 1984; Dolman *et al.*, 1988]. In the urban case it is modified to read

$$Q_E = \frac{s(Q^* + Q_F - \Delta Q_S) + (C_a V)/r_a}{s + \gamma(1 + r_s/r_a)}$$

where s is the slope of the saturation vapor pressure versus temperature curve (Pa °C⁻¹), γ is the psychrometric "constant" (Pa °C⁻¹), C_a is the heat capacity of the air (J m⁻³ °C⁻¹), V is the vapor pressure deficit of the air (Pa), and r_a and r_s are the aerodynamic and surface resistances (s m⁻¹). In this form the resistances for sensible and latent heat are equal and related to the equivalent resistance for momentum (often called the aerodynamic resistance r_a). The anthropogenic heat flux (Q_F) is included as an additional source term. The equation is applicable to dry surfaces (stage 3); when the surface is completely wet (stage 1), the r_s term is set to zero.

The overlap between the evaporation of intercepted water and transpiration is poorly defined in the Rutter model [Shuttleworth, 1983]. To link the two stages, a physically continuous transition between wet and dry canopies is required. Shuttleworth [1978] proposed such a model in which r_s is replaced by a redefined surface resistance r_{ss} , equal to r_s in dry conditions and set to zero in wet conditions, with a smooth transition between the two depending on the fractional surface wetness. Shuttleworth's theoretical

analysis has been tested over tall vegetation [Shuttleworth, 1978] and takes the form

$$r_{ss} = \left[\frac{W}{r_b(s/\gamma + 1)} \right] + \left[\frac{(1 - W)}{r_s + r_b(s/\gamma + 1)} \right]^{-1} - r_b(s/\gamma + 1)$$

where

$$W = 1 \quad C \geq S$$

$$W = \frac{R - 1}{R - S/C} \quad C < S$$

$$R = \frac{(r_s/r_a)(r_a - r_b)}{r_s + r_b(s/\gamma + 1)}$$

where $r_b = 1.1u_*^{-1} + 5.6u_*^{1/3}$ is the mean boundary layer resistance [Shuttleworth, 1983], and u_* is frictional velocity (m s⁻¹) (see section 3.4. for method of calculation).

The complete urban evapotranspiration-interception model uses submodels (see section 3) to identify and describe turbulent source areas and to calculate anthropogenic heat and storage heat fluxes, aerodynamic and surface resistances, drainage, and storage capacities. The model requires inputs to describe the surface and hourly meteorological data and provides outputs of surface water state and evapotranspiration (Table 1).

3. SUBMODELS

3.1. Source Area Identification

The urban atmosphere interface is extremely complex, defying simple description. For example, in a suburban land

use zone it is possible at one scale to identify an area which could be considered homogeneous (e.g., a residential area), within which there is a large degree of smaller-scale heterogeneity (e.g., buildings, vegetation, roads). The collection of surface elements that are sampled by a micrometeorological sensor are termed its "source area." In urban areas the surface is not necessarily homogenous at the scales of the source areas of the turbulent fluxes. The turbulent source area is upwind of the measurement site and in the direction of the prevailing wind. Its upwind, downwind, and lateral boundaries are dependent on the characteristics of the flow and on the boundary layer development in the atmospheric layer between the surface and sensor level. Further, the turbulent fluxes measured at a point have a continuously changing source area due to the variations in the flow and stability of the boundary layer.

In order to model evapotranspiration it is necessary to have surface descriptive information for the calculation of Q_F , ΔQ_S , D , surface resistance, and the overall Q_E . Therefore it is necessary to have a method to identify the appropriate source area and to retrieve the surface characteristics for the same area [Schmid *et al.*, 1991]. To identify these areas, a modified version of the Schmid and Oke [1990] source area model was used. The inputs necessary to determine the weighted source areas are the site conditions (roughness and zero-plane displacement) and meteorological scaling parameters (Obukhov stability length, friction velocity, and either the standard deviation of wind direction and mean wind speed or the mixed layer depth). The output of the model consists of nine source area ellipses for each hour (Figure 2). The area between each ellipse has equal weight, that is, the area labeled "a" contributes the same amount to the measured flux as that labeled "b". In the current work the Schmid and Oke [1990] model, which was developed for unstable conditions, was extended using the relations of Gryning *et al.* [1987] to incorporate stable conditions. The dimensions increase as conditions change from unstable to stable (Figure 2).

Combining the source area calculations with a surface description data base and a data accessing system allows a parameter to be assessed in response to different source areas shapes as meteorological conditions and scenarios change. Surface data for 100×100 m squares were collected for a 5-km radius circle centered on the tower (i.e., approximately 8000 squares).

3.2. Anthropogenic Heat Flux (Q_F)

The energy released due to human activities cannot be measured directly. C.S.B. Grimmond and T.R. Oke (manuscript in preparation, 1991) present the details of the method used to determine Q_F on an hourly basis. Q_F can be subdivided into three components:

$$Q_F = Q_{FV} + Q_{FH} + Q_{FM} \quad \text{W m}^{-2}$$

Q_{FV} , the heat released by vehicles, is a function of the amount of fuel used and its energy content. It can be related to the number of vehicles traveling within the source areas, the distance they travel, the type of fuel, and their fuel efficiency. Q_{FH} , the heat from stationary sources (primarily buildings), is determined from an inventory of the types of consumers and their consumption patterns within the source areas. Q_{FM} , the heat of metabolism, is small and a function

Fig. 2. Examples of the shape of the source areas calculated using the plume model. The nine weighted bands within the source area are also shown (radius of inner circle, 2 km; radius of outer circle, 5 km).

of the number of people and animals within the source areas and their metabolic rates. Hence each component requires information in the surface data base which can be accessed to fit the source area for that hour.

3.3. Storage Heat Flux (ΔQ_S)

In urban areas the subsurface or storage heat flux is the net uptake or release of energy from the urban system. It includes latent and sensible heat changes in the air, buildings, vegetation, and ground, extending from above roof level to a depth in the ground where the net heat exchange over the period of study is negligible [Oke and Cleugh, 1987]. It is not possible to directly measure the integrated heat storage of the urban system. Here the parameterization scheme of Grimmond *et al.* [1991] is used. The daytime storage heat flux is given:

$$\Delta Q_S = a_1 Q^* + a_2 \frac{\partial Q^*}{\partial t} + a_3$$

where a_1 , a_2 , and a_3 are empirical coefficients. The second term gives the hysteresis loop departures from the linear relationship. The empirical coefficients are derived from data for individual surface types and weighted according to their abundance in the source area. The active surface area in the source area involves determination of the plan area of green space, the three-dimensional area of buildings (roofs plus walls), and the plan area of paved surfaces. The surface coefficients are determined each hour for the appropriate source areas using the source area model and the surface data base. At night the storage heat flux is found to be approximately equal to the sum of the net all-wave radiation and anthropogenic heat flux.

3.4. Aerodynamic Resistance (r_a)

For a given wind speed and vapor pressure the rate of removal of water vapor depends on the atmospheric turbulence created by the wind blowing over the surface roughness elements. The integrated transfer coefficient for water vapor between the evaporating surface and some reference height in the free atmosphere is the aerodynamic resistance (r_a) or its reciprocal the aerodynamic conductance (g_a).

Under neutral atmospheric conditions, r_a is determined using the logarithmic wind profile. In nonneutral conditions, and for water vapor exchange, the following expression is used [Thom, 1972]:

$$r_a = \{ \ln [(z - d)/z_0] - \psi \} \{ \ln [(z - d)/z_{0v}] - \psi_v \} / (k^2 u)$$

where z is the height measurement (m), d is the displacement length (m), z_0 is the momentum roughness length (m), k is von Kármán's constant (0.41), u is the horizontal wind speed (m s^{-1}); ψ and ψ_v are the stability functions for momentum exchange and water vapor, respectively, and z_{0v} , the water vapor roughness length, is taken to be $0.1z_0$ [Brutsaert, 1982]. For unstable conditions the stability function for momentum is [van Ulden and Holtslag, 1985]:

$$\psi = 2 \ln [(1 + X)/2] + \ln [(1 + X^2)/2] - 2 \tan^{-1}(X) + \pi/2$$

where X is defined by Dyer [1974] as $X = (1 - 16z/L)^{0.25}$, L is the Monin Obukhov stability length (m), and the stability function for heat and water vapor is [van Ulden and Holtslag, 1985]

$$\psi_H = 2 \ln [(1 + y^2)/2]$$

where y is defined by Dyer [1974] as $y = (1 - 16z/L)^{0.25}$

For the stable case the functions of Dyer [1974] are used for heat and water vapor:

$$\psi_H = -5(z - d)/L$$

and the functions of van Ulden and Holtslag [1985] for momentum:

$$\psi = -17\{1 - \exp[-0.29(z - d)/L]\}$$

L is calculated iteratively with u_* using Randerson [1984] when sensible heat flux data are available:

$$L = -(u_*^3 \rho c_p T_d) / (kg Q_H)$$

where g is acceleration due to gravity (9.81 m s^{-2}), c_p is specific heat capacity of air at constant pressure ($\text{J kg}^{-1} \text{ K}^{-1}$), ρ is density (kg m^{-3}), and T_d is dry bulb temperature ($^{\circ}\text{C}$). L is calculated using van Ulden and Holtslag [1985] when temperature differences are used:

$$L = (T_d u_*^2) / (kg \Theta_*)$$

where Θ_* , the temperature scale for turbulent heat transfer, is

$$\Theta_* = (k\Delta\Theta) / \{ \ln [(z_2 - d)/z_1] - \psi_H[(z_2 - d)/L] + \psi_H[(z_1 - d)/L] \}$$

$\Delta\Theta$ is the potential temperature difference [McIntosh and Thom, 1972]

$$\Delta\Theta = \Delta T(100/p)^K$$

$K = R/c_p$, R is the gas constant of dry air ($287.04 \text{ J kg}^{-1} \text{ K}^{-1}$), and p is pressure (Pa). Here u_* is calculated using Van Ulden and Holtslag [1985]:

$$u_* = [ku(z_3 - d)] / \{ \ln [(z_3 - d)/z_0] - \psi[(z_3 - d)/L] + \psi(z_0/L) \}$$

where $u(z_3)$ is the wind speed at the height of the anemometer (m s^{-1}). When information to calculate the stability correction is not available, the neutral form of r_a is used. This has been found satisfactory over forests [Shuttleworth, 1989].

3.5. Surface Resistance (r_s)

When there is no rain or dew on vegetation, water loss occurs through the stoma. This process is biologically controlled and changes with micrometeorological conditions. The biophysical and biochemical mechanisms of stomatal resistance (r_{ST}) are poorly understood [Shuttleworth, 1989]. The form of stomatal response is qualitatively similar from one species to the next but exhibits marked variations in quantitative terms both between and within species [Jarvis *et al.*, 1976]. At the whole canopy scale, Shuttleworth [1976, 1978, 1979] shows that the bulk stomatal resistance is closely related to the surface resistance (r_s), as defined by Monteith [1965]. In this approach the complex array of r_{ST} for the individual leaves is replaced by an equivalent system containing a single hypothetical leaf with a single r_s . Thom [1972] showed that if the source of evaporation is a forest canopy, and the aerodynamic resistance correctly describes the transfer of water, then r_s is equivalent to the bulk r_{ST} . In the more general case where some of the water vapor comes from other layers (e.g., litter or understory), changes in r_s also reflect changes in their rates of evaporation [Stewart, 1988]. In urban areas the diversity of vegetation makes the determination of a bulk stomatal resistance virtually impossible because of sampling problems and the added complication posed by the nonvegetated areas. Here r_s is modeled as a single integrated resistance for the whole system.

At present there is insufficient knowledge to interpret the effects of environmental variables on r_{ST} using a mechanistic model [Stewart, 1988], but a physically based model proposed by Jarvis [1976] can be used to predict r_{ST} from empirical relationships between r_{ST} and controlling environ-

mental variables. This form of model is promising for use in urban areas. It has the advantage of being dynamically responsive to both meteorological and seasonal conditions.

The general form of whole-canopy models for forests [e.g., Lindroth, 1985; Gash *et al.*, 1989; Sellers *et al.*, 1986; Shuttleworth, 1988, 1989; Stewart, 1988], expressed as a conductance, (g_s) is

$$g_s = G_1 L g(\text{variables})$$

where G_1 is the maximum value of the surface conductance (m s^{-1}), L is the leaf area index (LAI), and $g(\text{variables})$ are the functions of the environmental variables which have values between zero and unity.

This general form was used to develop a model for the Sunset study site. It assumes that surface conductance is a function of the nonsynergistic interaction between stomatal aperture, LAI, and environmental variables. It operates on an hourly time scale. The environmental variables identified by Jarvis [1976] were not available and were replaced by closely related ones: quantum flux density was replaced with net radiation (Q^*), leaf-air specific humidity was replaced with specific humidity deficit (δq) [c.f. Stewart, 1988], leaf temperature was replaced by air temperature (T), and leaf water status was replaced by soil moisture deficit ($\delta\theta$), so that

$$g_s = G_1 g(Q^*) g(\delta q) g(T) g(\delta\theta) g(L)$$

The dependence on Q^* is expressed using the same mathematical form of equation used for solar radiation [e.g., Shuttleworth, 1989]:

$$g(Q^*) = [Qm/(G_2 + Q^*)]/[Qm/(Qm + G_2)]$$

where Qm is the annual maximum hourly net radiation (W m^{-2}), and G_2 is a fitted parameter (W m^{-2}). The dependence on δq is expressed as [Gash *et al.*, 1989; Stewart, 1988]

$$g(\delta q) = 1 - G_3 \delta q \quad 0 < \delta q < G_4$$

$$g(\delta q) = 1 - G_3 G_4 \quad \delta q \geq G_4$$

The dependence on T is given [Stewart, 1988]:

$$g(T) = (T - T_L)(T_H - T)^{T_c} / [(T - T_L)(T_H - T)^{T_c}]$$

where

$$T_c = (T_H - G_5)/(G_5 - T_L)$$

and T_L and T_H are minimum and maximum temperature limits ($^{\circ}\text{C}$). The dependence on $\delta\theta$ is described by [Stewart, 1988]

$$g(\delta\theta) = 1 - \exp \{G_6[\delta\theta - (S_1/G_6 + S_2)]\}$$

where S_1 and S_2 are fitted parameters which relate to the maximum $\delta\theta$. The dependence on LAI follows Dolman *et al.* [1988] but allows for the greater diversity of vegetation found in a suburban area compared to a temperate forest:

$$g(L) = [(LA_U)/Lm + A_I]/(A_U + A_I)$$

where A_U is the area unirrigated (m^2), Lm is the maximum leaf area index in A_U , and A_I is the area irrigated (m^2).

The values of the parameters (G_1 – G_6) for the study area were optimized using nonlinear least squares regression

[Denis *et al.*, 1981; Gay, 1983; Moore, 1986] between “measured” values of r_s and the selected environmental variables. “Measured” surface resistance (r_s) is determined when the surface is dry by rearranging the Penman-Monteith equation and using measured Q_E and β [Monteith, 1965]

$$r_s = \left(\frac{s\beta}{\gamma} - 1 \right) r_a + \frac{C_a V}{\gamma Q_E}$$

3.6. Drainage (D)

Determination of the drainage rate for urban areas is a problem because it does not correlate directly with urban runoff. It has to be envisaged as that loss from the “storage layer” which is no longer available for evaporation, for example, the water may enter a pipe system or infiltrate into the soil. Given the range of vegetation and other surface types in urban areas, the measurement of the drainage rate involves a vast sampling problem. Even in forest areas there is a significant error involved in the measurement of this term [Shuttleworth, 1989].

The urban drainage function developed here describes the rate at which water drains from a single-layer moisture store (Figure 1) and is set proportional to the current water status of the store. The original Rutter *et al.* [1971, 1975] formulation had the inherent difficulty of predicting a finite drainage when the canopy is dry [Calder, 1977]. It has been rewritten [e.g., Halldin *et al.*, 1979] to rectify this so that it reads

$$D = D_0 \exp [(bC) - 1] \quad (5)$$

where D_0 is the drainage rate when $C = S$, b is an empirical coefficient, and S is the amount of water the canopy retains after the rainfall and throughfall cease (the storage capacity). This equation is used in the model for the proportion of the source area which is vegetated but not irrigated.

For the impervious area, values from the urban runoff literature are used. They usually relate to the runoff from a single surface type rather than a land use area. Falk and Niemczynowicz [1978] propose the following equations for the relationship between drainage and storage:

$$D = D_0(C_{t-1} - S)^b \quad (6)$$

$$D = D_0(C_{t-1})^b \quad (7)$$

Equation (6) allows no drainage when $C < S$. This assumption has also been used in forested areas, for example by Gash and Morton [1978] and Mulder [1985]. Pratt *et al.* [1984] suggest that the rate of drainage from flat roofs can be assumed to be the same as paved surfaces of 1% slope. Equation (7) is used for the paved, built surfaces and for irrigated grass. The values of the coefficients for (5)–(7) are taken from Calder and Wright [1985] and Falk and Niemczynowicz [1978] and are listed in Table 2.

3.7. Storage Capacity (S)

The values of the surface storage capacity, like the drainage functions, are based on values taken from the literature (Table 2). The capacity for a surface type is assumed to be constant through time for all types except deciduous vegetation, where allowance is made for seasonal change. The values used are as follows: paved surfaces, 0.48 mm [Falk and Niemczynowicz, 1978]; roofs, 0.25 mm [Davies and

TABLE 2. Values Assigned to Parameters for the "Base" Run of the model in Vancouver, 1987

Surface Characteristics						
	Pavement	Building	Coniferous	Deciduous	Unirrigated Grass	Irrigated Grass
S , mm	0.48	0.25	1.2	0.3	1.3	1.3
D function Coefficient	7	7	5	5	5	7
D_0	10	10	0.013	0.013	0.013	10
b	3	3	1.71	1.71	1.71	3
$C(t = 0)$	0.0	0.0	0.0	0.0	0.0	0.0
Parameter			Value			
<i>Site Characteristics</i>						
d , m					3.50	
Z_0 , m					0.52	
<i>Deciduous Transitions</i>						
T_b					YD 87/65	
T_e					YD 87/115	
S_{ds} , mm					0.80	
<i>Surface Conductance</i>						
Lm					3.10	
T_H , °C					40.00	
T_L , °C					0.00	
$S1$, mm					0.45	
$S2$, mm					15.00	
Q max, $W\ m^{-2}$					725.00.00	
G_1 , $mm\ s^{-1}$					53.95	
G_2 , $W\ m^{-2}$					633.95	
G_3 , $kg\ g^{-1}$					0.0821	
G_4 , $g\ kg^{-1}$					8.91	
G_5 , °C					18.88	
G_6 , mm^{-1}					0.0107	
r_s max, $s\ m^{-1}$					9999.00	

Hollis, 1982]; coniferous trees, 1.2 mm [Shuttleworth, 1989]; deciduous trees when leafless, 0.3 mm; deciduous trees when in leaf, 0.8 mm [Shuttleworth, 1989]; and grass, 1.3 mm [Zinke, 1967].

4. FIELD MEASUREMENTS

In order to test the evapotranspiration model and its submodels, data were collected in the Sunset suburb of Vancouver, B.C. (49° 15'N, 123° 18'W) (Figure 3). The city is situated at the west end of the Lower Fraser Valley and has low to moderate relief. The Sunset area has predominantly one- and two-story single family dwellings and slopes slightly southwest toward the Fraser River.

The objective was to determine spatially averaged fluxes from an area of suburban land use at the local scale [Oke, 1984], rather than from individual surfaces such as lawn or pavement. Therefore measurements were conducted from a tower well above the height of the roughness elements to ensure that observations were conducted in the surface layer. On the basis of the results of Roth *et al.* [1989] all sensors were mounted at heights >20 m above zero-plane displacement, and the averaging time was 60 min.

The environmental variables measured were net radiation flux density (with a net pyrradiometer), sensible heat flux density (with a sonic anemometer-thermometer), wind speed and direction, wet- and dry-bulb air temperature (see below), relative humidity, surface wetness (see below), precipita-

tion, and soil moisture deficit (see below). Full details of the measurements are available from Grimmond [1988]. All times referred to are local apparent time (LAT) (plus 0800 UT) and year day (YD).

The reversing temperature difference measurement system used to determine β , was similar to that described by McCaughey *et al.* [1987]. The wet- and dry-bulb thermocouples (10 junction copper/constantan thermopiles) were mounted within shields on two carts which move up and down on a trackway. The carts, separated by 7.1 m, are reversed twice each hour. A ten-min period allows for travel and equilibration at the new level. The remaining 20 min at each level allowed for two 10-min averages.

The surface wetness sensors followed the design of Weiss and Lukens [1981]. The sensors consist of a frame (0.1 × 0.1 m) with 30 AWG wire threaded across the center and muslin material weaved through the wire. The wire has 2 V ac passed through it, and the output voltage varies depending on the wetness of the material (a surrogate for the surface). The output does not give a numerical value of degree of wetness but an indication of whether the surface is wet or dry. Two such sensors were located on unirrigated grass and a third in a coniferous hedge, starting on YD 87/38. Visual observations of the drying of different types were also made throughout the measurement period.

Gravimetric soil moisture samples were taken approximately three times a week from two sites near the tower.

Fig. 3. The location of the Sunset study site in the Vancouver area and the surrounding land uses.

From mid-May (YD 87/133), samples were gathered at an additional three sites, both irrigated and nonirrigated, around the tower area. The average dry weight moisture content for the profile from the surface to a depth of 200 mm was determined and used with dry bulk density measurements to determine soil moisture deficit.

Water use was monitored from YD 87/139 by the Engineering Department, City of Vancouver, in the nearby residential area of Oakridge (Figure 3). The water use for the 21-ha catchment was recorded at 15-min intervals with a resolution of 2.832 m^3 . The external water use (i.e., mainly for irrigation) was separated from the total use on the basis of experience in the same catchment [Grimmond and Oke, 1986]. It was assumed that the same depth of water was applied to the irrigated area in the Sunset suburb as was applied in the Oakridge catchment. From visual surveys at both sites it was determined that different proportions of the residential vegetation were irrigated (Oakridge, 95%; Sunset, 60%). The external water use data set was extended back to YD 87/121, selected as the day of the onset of irrigation (based on observations and Grimmond [1983]), by using a multiple regression equation developed from the hourly 1987 data set incorporating time of day, hours since rain, available energy, temperature, and vapor pressure deficit.

5. DEVELOPMENT OF THE SURFACE CONDUCTANCE SUBMODEL

Figure 4 shows the ensemble mean and standard deviation of g_s at the Sunset suburban site for 543 hours. The diurnal trend is similar to that reported for forests [e.g., Shuttleworth, 1989], but the values are approximately 75% smaller and have approximately double the hourly standard deviation [e.g., Stewart and de Bruin, 1984; Shuttleworth, 1988; Stewart, 1988]. The smaller size of g_s in urban areas is undoubtedly due to the presence of nonvegetated surfaces.

The surface resistance submodel was developed and tested using data for 543 daylight hours when the surface was dry. To be dry, a surface must meet the following criteria [Shuttleworth, 1988]: rain is not recorded in the current or previous 3 hours; 3 hours with positive Q^* have occurred since rainfall; the hour preceding recorded rain was regarded as not dry; in the morning, 2 hours have elapsed since Q^* first became positive; the wetness sensors record the surface as dry; and there are no visible puddles or other traces of rain.

To develop and test the model, the Sunset data set was split into two independent sets by arbitrarily putting alternate days into separate sets: one of 300 hours (AD1) and the other of 243 hours (AD2). This approach was adopted because no independent data set exists for a suburban area

Fig. 4. Diurnal trend of ensemble mean and standard deviation of measured surface conductance for Sunset suburban site, Vancouver, British Columbia, for dry, daylight hours. The shaded area shows the range of values from eight forests [from Shuttleworth, 1989, Figure 10].

which covers a sufficiently wide range of conditions.

The environmental variables controlling conductance were determined as follows. Q^* and T were measured directly, δq was calculated from measured T and pressure p . $\delta\theta$ was determined for unirrigated areas using profiles of gravimetric soil moisture and the dry bulk density of the soil. Irrigated areas were found to have no $\delta\theta$ at any time. The

surface description data base and the source area model enabled the areas with coniferous, deciduous, and irrigated and unirrigated grass to be identified for each hour. Thus an areally weighted $\delta\theta$ was determined for each hour. It was assumed that all of the irrigated area is grass and that mowing keeps the LAI of the grass constant at 1.6 [Ripley and Redmann, 1975].

The LAI for the unirrigated area was determined as an areally weighted average of the coniferous, deciduous, and grass values for each hour. The LAI of coniferous and deciduous vegetation were set to lie in the ranges of 4–6 and 0–4, respectively [Kramer and Kozlowski, 1979]. A full circle panorama of photographs was taken from the tower weekly to identify the stages of the growing season. They were used to model LAI for each day for the two vegetation types using [Street and Opik, 1984]

$$\log \frac{L + 1}{a - (L + 1)} = k[(d - d_0) - (d_1 - d_0)]$$

where a is the maximum LAI minus the winter minimum, k is a fitted parameter (0.05), d is the day of interest, d_0 is the starting day of the curve from winter minimum of LAI (YD 87/45), and d_1 is the day of inflection of the S curve (YD 87/95). It was possible to assign a daily value of LAI for each vegetation type and, depending on the source area being sampled, to determine the weighted average of LAI for each hour. The proportion of the source area irrigated was determined from visual surveys and water use data in conjunction with the data base and the source area model.

The other model parameters were assigned as follows: maximum areally weighted L_m is 3.1, based on the calculated LAI; Q_m was set to 725 W m^{-2} using measured Q^* during June; T_H was set to 40°C and T_L to 0°C following Stewart [1988] and Gash *et al.* [1989]; and S_1 and S_2 were

TABLE 3. Fitted Parameters and Test Statistics for the Surface Resistance Model

Model	n	G_1 , mm s^{-1}		G_2 , W m^{-2}		G_3 , kg g^{-1}		G_4 , g kg^{-1}		G_5 , $^{\circ}\text{C}$		G_6 , mm^{-1}	
(a) Fitted Model Parameters													
AD1	300	56.35		694.0		0.0857		9.44		20.07		0.0105	
AD2	243	53.95		634.0		0.0821		8.91		18.88		0.0107	
AII	543	55.20		669.6		0.0840		9.02		19.56		0.0106	
Model	Test	r^2	m_0	m	c , mm s^{-1}	RMSE_s , mm s^{-1}	RMSE_{s_1} , mm s^{-1}	RMSE_{u_1} , mm s^{-1}	d	n			
(b) Model Development Statistics													
AD 1	AD 1	0.61	0.90	0.62	2.37	2.35	1.45	1.85	0.87				
AD 2	AD 2	0.71	0.93	0.73	1.47	1.75	0.88	1.52	0.91				
AII	AII	0.65	0.91	0.66	1.99	2.11	1.21	1.73	0.89				
(c) Model Test Statistics													
AD 1	AD 2	0.71	0.89	0.74	1.20	1.79	0.91	1.54	0.91				
AD 2	AD 1	0.61	0.92	0.61	2.60	2.36	1.47	1.85	0.87				
May–June													
AD 1	AD 2	0.72	0.89	0.74	1.14	1.75	0.89	1.50	0.91	184			
AD 2	AD 1	0.65	0.92	0.65	2.49	2.26	1.38	1.79	0.88	202			

Statistics are n , number of hours; m_0 , slope forced through the origin; m and c , slope and intercept for ordinary linear regression; RMSE , root-mean-square error; RMSE_s , systematic error; RMSE_u , unsystematic error; d , index of agreement [Willmott, 1984].

Fig. 5. Comparison between hourly measured and modeled surface conductance using data set AD2 for modeled AD1.

determined by trial and error [Dolman *et al.*, 1988] to be 0.45 and 15 mm, respectively.

Table 3 lists the fitted parameters and the test statistics for the separate and combined data sets. The values of the model parameters G_3 to G_6 are similar to those reported by Stewart [1988] and Gash *et al.* [1989] for temperate forests (Thetford, U.K., and Les Landes, France, respectively). G_1 and G_2 are not the same as those of these forested sites. This is expected for G_1 because the urban canopy vegetation is more heterogeneous and sparse. Second, G_2 is associated with net all-wave radiation in this study rather than net solar radiation, as in the other studies. This is the best form of the model after several attempts to incorporate urban features.

The statistics pertaining to model development and performance are presented in Tables 3b and 3c, respectively, and in Figure 5. The model was first developed using data set AD2 and tested against AD1, then the process was reversed. The r^2 of 0.71 for model AD2 is similar to that reported by Stewart [1988]. AD1 always gave a lower degree of explanation. This is attributed to a greater number of outliers associated with cloudy and partly cloudy hours, suggesting that the net radiation function is inadequate for such conditions. All three models show larger unsystematic than sys-

Fig. 6. Ensemble mean of measured and modeled surface conductance using data set AD2 for modeled AD1.

TABLE 4. Statistics for the Comparison Between Measured and Modeled (Using "Base" Values) Q_E for Vancouver, British Columbia

Statistic	Hourly	Daily
n	2944	125
Mean, $W m^{-2}$		
Measured	40.10	40.49
Modeled	40.38	41.87
Standard deviation $W m^{-2}$		
Measured	63.03	21.80
Modeled	58.20	23.87
m	0.83	0.93
r^2	0.81	0.71
d	0.95	0.91
N&S*	0.81	0.64
RMSE, $W m^{-2}$	27.65	13.00
RMSE _s , $W m^{-2}$	10.72	2.17
RMSE _u , $W m^{-2}$	25.49	12.82

*Nash and Sutcliffe [1970] goodness of fit.

Fig. 7. Comparison of measured and modeled Q_E for the "base" model run for Vancouver, British Columbia: (a) hourly (b) daily.

tematic errors, which indicates there is only a small bias in the model estimates. The slope of the best fit line indicates an overprediction for low g_s (high r_s) and an underprediction for high g_s (low r_s). The slopes forced through the origin (Table 3c) are similar to those obtained by Stewart [1988]. Figure 6 shows the diurnal trend of the ensemble mean measured and modeled g_s . The modeled and measured data exhibited the same trend using either model. In both cases the model underpredicts in the morning.

The ADI model was selected to calculate r_s in the evapotranspiration-interception model because it has the lowest root-mean-square error (RMSE), and the slope of the line (m) is the closest to unity.

6. PERFORMANCE OF THE URBAN EVAPOTRANSPIRATION MODEL

6.1. Methods Used to Assess the Performance of the Model

The model was initialized, with the surface dry, on February 3 (YD 87/33) at 0000 LAT and terminated on June 28 (YD 87/179) at 0800 LAT, when field measurements ceased. During this 3513-hour period, Q_E was modeled continuously, and there are 2944 hours of measured data available for comparison.

The performance of the model is evaluated at a number of temporal scales: (1) hourly, each hour with both measured and modeled flux data, (2) daily, fluxes for all hours, when both measured and modeled data are available on a day, are averaged and compared, because of missing data a "day" does not necessarily consist of 24 hours, (3) cumulative hourly, hours when both measured and modeled data are accumulated and compared (because of missing data the values are less than the "true" total E for the time period (YD 87/33–179)), and (4) ensemble hourly, for each month and for the whole time period (YD 87/133–179) the values for a particular hour are averaged. The modeled surface water state was also compared with that from two wetness sensors.

6.2. "Base" Run of the Model

For the "base" run of the model the values assigned to the various parameters were chosen to be the most physically realistic (Table 3). They are not a best fit to the model.

The statistics of the model's performance as compared to the measured Q_E are presented on an hourly and daily basis in Table 4. The results for the model are better on an hourly than a daily basis primarily because of the large number of hourly data points (Figures 7a and 7b). In both figures the data are distributed around the one to one line, and the hourly RMSE of 27.7 W m^{-2} is of the same order as the error of the measurements. The cumulative E for the measurement period (Figure 8) shows that the model underpredicts up to about YD 87/65, overpredicts between YD 87/140–160, and matches for the remainder of the period.

Figure 9 shows the time series of measured and modeled Q_E for two periods. In the early part of the year the model underpredicts during the middle of the day (Figure 9a). From about YD 87/75 the model mimics the measured data extremely well under all conditions except during dewfall (Figure 9b).

Figure 10 provides a means to compare the modeled surface state with that recorded by the wetness sensors. In

Fig. 8. Cumulative measured and modeled ("base" run) evaporation for Vancouver, British Columbia.

each box of five traces the upper two plots show the water arriving at the surface; at the top is the rainfall received by all surfaces, and the second is the external water use (wu) which is only received by the irrigated grass portion of the

Fig. 9. Time series of hourly measured and modeled Q_E ("base") for Vancouver, British Columbia. Note that the measured data are not continuous (a) YD 87/47–57 (b) YD 87/140–150.

Fig. 10. Time series of hourly precipitation, water use, surface water use, surface wetness, and modeled surface water state for Vancouver, British Columbia (see text for details) (a) YD 87/54-74 (b) YD 87/116-136.

surface. External water use did not begin until YD 87/121. The third plot shows the status of the wetness sensors (i.e., whether wet or dry). Note that the sensor located on the grass (dashed curve) has a smaller range. The fourth trace is the modeled surface water status of the whole surface, and the fifth or lowest plot shows the modeled wetness status of the individual surface types. The six individual surfaces are not separately labeled, but the vegetated surfaces are those which hold more water on the surface, and the lesser values are the built and paved surfaces. Once irrigation begins (Figure 10b), the state of the irrigated grass surface (the dashed curve in the lowest plot) becomes distinguishable from the other surfaces. In general, the model does an extremely good job of indicating when the surface is dry. Visual observations indicate that the paved and built surfaces dry more quickly than the vegetated surfaces, and as

Figure 10 shows, the modeled paved and built surfaces mimic this pattern. This suggests that the drainage functions in the evaporation model simulate the surface water state appropriately. The only feature not well represented is dewfall which was visible on the grass sometimes but not simulated.

6.3. Sensitivity Analysis of the Model

In order to assess the robustness of the model and its sensitivity to various input parameters and equations its performance was investigated when inputs were changed over a range. The effects of such changes are reported in comparison to both the measured results and the base run. Unless otherwise specified only one variable was changed from the base run (Table 3). Cumulative plots show the influence of the changes on the modeled evaporation (E) and allow seasonal effects to be gauged.

6.3.1. Time step. When this type of model is used in forests, time steps of 120 [Shuttleworth, 1988], 300 [Rutter et al., 1971], and 720s [Sellers and Lockwood, 1981] have been used. These rather short time steps allow for changes in the drainage rate, surface state, and evapotranspiration rate within an hour. The "base" time step used in this study is 300s, that is, 12 steps per hour.

Decreasing the computational interval to 120 s does not improve the performance of the model and extending it to 720 s shows slight improvement. Changing to 3600 s causes a further slight improvement in the statistics, but the surface dries too quickly so the surface water state shows a series of spikes rather than the more realistic gradual drying curves seen in Figure 10.

We conclude that the model can be run at the longer 720-s time step and maintain a realistic surface state, but extending to one hour results in less realistic predictions of surface water state.

6.3.2. Aerodynamic resistance r_a . The base version of the model uses the stability corrected equation for r_a . Runs made using the neutral and the Thom and Oliver [1977] equations for r_a indicate that the model is not very sensitive to which equation is used, and Q_E values are similar. Therefore it is not essential to have the input necessary to calculate the stability functions for the determination of r_a . In many forest evaporation-interception studies the neutral method has been used alone and found to be satisfactory [Shuttleworth, 1988].

6.3.3. Surface resistance r_s . Two types of changes affecting r_s were run: first, alterations in r_s maximum and second, changes to the values of the parameters within the r_s submodel (section 3.5).

The model was run with five different methods to deal with large r_s (or g_s approaching zero) and negative Q^* . In the base run, when g_s approaches zero or becomes negative, r_s is set to 9999 s m⁻¹. In the other four cases, r_s was set to 9999, 2500, 1250, or 750 s m⁻¹ when Q^* was negative. The performance statistics show little difference between the base run and those with $r_{s\max} = 9999$ s m⁻¹. As the value of $r_{s\max}$ is decreased, the performance deteriorates slightly. There is a systematic influence on the cumulative flux, primarily due to the fact that as $r_{s\max}$ is reduced, nighttime values of Q_E increase, and therefore accumulated Q_E becomes larger. However, the daytime performance is not improved.

TABLE 5. Statistics of Model Performance for Q_E When the Storage Capacity (S) is Changed for Irrigated and Unirrigated Grass

	S Capacity (Irrigated, Unirrigated), for Grass, mm				
	0.5, 0.5	1.3,* 1.3	6.4, 6.4	7.6, 7.6	7.6, 10.2
<i>Hourly Statistics</i>					
Mean, $W\ m^{-2}$	43.08	40.38	38.03	37.91	37.87
sd, $W\ m^{-2}$	59.91	58.20	56.72	56.65	56.65
m	0.84	0.83	0.82	0.82	0.82
r^2	0.78	0.81	0.83	0.83	0.83
RMSE, $W\ m^{-2}$	30.07	27.65	26.42	26.39	26.40
RMSE _s , $W\ m^{-2}$	10.58	10.72	11.69	11.75	11.76
RMSE _u , $W\ m^{-2}$	28.15	25.49	23.70	23.63	23.63
d	0.94	0.95	0.95	0.95	0.95
N&S†	0.77	0.81	0.82	0.82	0.82
<i>Daily Statistics</i>					
Mean, $W\ m^{-2}$	44.66	41.87	39.44	39.31	39.25
sd, $W\ m^{-2}$	26.09	23.87	22.45	22.39	22.42
m	0.98	0.93	0.98	0.89	0.89
r^2	0.67	0.71	0.75	0.75	0.75
RMSE, $W\ m^{-2}$	15.60	13.00	11.58	11.53	11.52
RMSE _s , $W\ m^{-2}$	4.20	2.17	2.61	2.69	2.68
RMSE _u , $W\ m^{-2}$	15.02	12.82	11.28	11.21	11.21
d	0.89	0.91	0.93	0.93	0.93
N&S	0.49	0.64	0.72	0.072	0.72

References for S capacity values are as follows:

1.3, Zinke [1967];

6.4, Brater [1968], Mechler and Riecken [1977], and Nouh [1986];

7.6, Wright-McLaughlin Engineering [1969];

10.2, Wright-McLaughlin Engineering [1969].

*Base value.

†Nash and Sutcliffe [1970].

The r_s parameters (G_1 – G_6) were changed between the three sets of model parameters presented in Table 3 (AD2 is the base set). The base results are generally slightly better. Using AD1 and All parameters, the calculated daytime fluxes are slightly less than for the base case. The values obtained using AD1 are smaller than those using the All parameters. The AD1 and All versions of the runs remain closer to parallel with the measured cumulative E during the later months.

The model responds to reasonably small changes in r_s (as will be produced by changing r_s model parameters), but it is not so sensitive as to make the use of any of the models in section 5 unwise.

6.3.4 Storage capacity (S). Three types of changes were made to the model relating to the storage capacity: first, changing S for an individual surface while keeping the rest at the base value, second, changing all surfaces values, and third, changing S in conjunction with the drainage functions. The results of the latter are discussed in section 6.3.5.

In this first test the value of S for each surface type was changed over a range of values determined from previous studies. It should be appreciated that the response of the model also depends on the relative abundance of the surface type within the study area.

Paved and building: When S was changed from 0.30 to 2.50 mm for paved and from 0.25 to 2.5 mm for buildings, there were only slight decreases in mean modeled values of Q_E and its RMSE, RMSE_s, and RMSE_u. This is reassuring because it is difficult to measure and/or assign absolute

values to this parameter [see Falk and Niemczynowicz, 1978].

Trees: Changing S for coniferous vegetation from 0.75 to 2.5 mm, the size of the winter and summer values of S for deciduous vegetation, and the timing of the transition between winter and summer are virtually undetectable. However, it should be noted that deciduous and coniferous vegetation occupy only a small area of the study site.

Grass: S was varied over the large range from 0.5 to 10.2 mm that is found in the literature (Table 5). The irrigated and unirrigated grass are assigned the same value except for one case where the unirrigated is given 10.2 mm and the irrigated 7.6 mm. The model shows a distinct response to the size of S for grass because the changes are much larger than other surface types and because grass is the most extensive surface type in the study area. It is apparent from Figure 11 that the larger the value of S the smaller the modeled E , down to a limit of 6.4 mm above which S has no further influence. Once external water use begins (YD 87/121) on a portion of the grass, there is a distinct increase in the modeled values of E (i.e., a steeper slope in Figure 11). The statistics show slightly contradictory effects of changing S at the hourly and daily scales. With increasing S the hourly statistics show a decreased slope m , and increased r^2 , a decreased RMSE and RMSE_u, but an increased RMSE_s. On a daily basis, however, increasing S is associated with a decrease in RMSE and in both the RMSE_s and RMSE_u. The hourly ensemble data show that the largest difference from the base results occurs at 1800 LAT. In the winter the difference at this time is $\leq 7\ W\ m^{-2}$ for $S = 0.5\ mm$ and ≤ 20

Fig. 11. Influence of the value assigned to the surface storage capacity of grass on cumulated E .

$W m^{-2}$ in June. With large values of S the modeled Q_E is reduced by $2-3 W m^{-2}$ during the winter, and in June the maximum difference is approximately $6 W m^{-2}$ in the morning and $15 W m^{-2}$ in the late afternoon. It appears from this sensitivity analysis that the size of S for grass which influences the modeled Q_E is around the value of $1.3 mm$ suggested by Zinke [1967].

In four runs all the values of S for the different surfaces were changed together (see Table 6 for details): first, all values of S were decreased to small values, second, all were assigned large values, third, all were set to $0.5 mm$, and fourth, all were set to $1.0 mm$. All of the runs underpredict Q_E until the onset of irrigation, as does the base run. After that the slope of the cumulative curve steepens considerably for all runs except for the case where all S values were large. After about YD 87/145 the slopes for all curves, except the base run, are similar to the measured values, suggesting they are performing well on a hour-to-hour basis. The comparison statistics suggest that when S is set to larger values the model performs better (Table 6).

6.3.5 Drainage functions (D). The drainage functions were varied over a range of coefficients and equation types (see Table 7 for details). Initially, the storage capacities for all surfaces were set to one value then changed to $0.5, 1.0$, and $2.0 mm$. The largest cumulative values are obtained when $S = 0.5 mm$. With all of the models the beginning of external water use is associated with a steep rise in the slope of the cumulative curves. When $S = 0.5 mm$, all of the cumulative curves cross the measured E curve. When $S = 1.0 mm$ and (7) is used, the cumulative E is less than the

TABLE 6. Statistics of Model Performance for Q_E When the Storage Capacity (S) is Changed for All Surface Types

	S Capacity For All Surfaces, mm				
	Small	Base	Large	All	All
S pavement	0.30	0.48	2.50	0.5	1.0
S building	0.25	0.25	2.50	0.5	1.0
S coniferous	0.75	1.20	2.50	0.5	1.0
S deciduous*	0.20	0.30	0.40	0.495	0.995
S grass	0.50	1.30	7.60	0.5	1.0
<i>Hourly Statistics</i>					
Mean, $W m^{-2}$	43.26	40.38	36.85	47.39	45.72
sd, $W m^{-2}$	59.92	58.20	56.92	63.03	62.33
m	0.84	0.83	0.82	0.87	0.87
r^2	0.78	0.81	0.83	0.75	0.77
RMSE, $W m^{-2}$	30.16	27.65	26.48	33.40	31.71
RMSE _s , $W m^{-2}$	10.66	10.72	11.75	11.15	10.13
RMSE _u , $W m^{-2}$	28.21	25.49	23.73	31.49	30.05
d	0.94	0.95	0.95	0.93	0.93
N&S†	0.77	0.81	0.82	0.72	0.75
<i>Daily Statistics</i>					
Mean, $W m^{-2}$	44.87	41.87	38.09	49.20	47.39
sd, $W m^{-2}$	25.99	23.87	23.21	29.27	28.77
m	0.97	0.93	0.92	1.04	1.05
r^2	0.66	0.71	0.76	0.60	0.63
RMSE, $W m^{-2}$	15.66	13.00	11.76	20.46	18.90
RMSE _s , $W m^{-2}$	4.42	2.17	2.87	8.76	6.97
RMSE _u , $W m^{-2}$	15.03	12.82	11.40	18.49	17.57
d	0.88	0.91	0.93	0.83	0.85
N&S	0.48	0.64	0.71	0.12	0.25

Deciduous values for summer, using the same headings as above, are 0.60, 0.80, 0.90, 0.5, and 1.0, respectively.

*Deciduous value for winter

†Nash and Sutcliffe [1970].

TABLE 7. Statistics of Model Performance for Q_E When the Drainage Functions are Changed and $S = 0.5$ mm

	Drainage Functions							<i>Rutter et al.</i> [1971]¶
	v*	v†	(7)‡	(5)§	(5)	(7)‡	(7)‡	
Coefficient D_0	v	v	10	0.013	0.018	32	12	0.0014
Coefficient b	v	v	3	1.71	1.76	1.5	1.5	5.25
<i>Hourly Statistics</i>								
Mean, $W m^{-2}$	40.38	47.39	41.88	49.92	48.82	46.77	46.90	45.11
sd, $W m^{-2}$	58.20	63.03	59.77	65.65	64.09	61.26	61.32	60.67
m	0.83	0.87	0.83	0.88	0.87	0.84	0.84	0.84
r^2	0.81	0.75	0.77	0.72	0.73	0.75	0.75	0.76
RMSE, $W m^{-2}$	27.65	33.40	30.26	36.78	35.32	32.83	32.88	32.13
RMSE _s , $W m^{-2}$	10.72	11.15	10.58	12.23	11.99	11.98	12.01	11.47
RMSE _u , $W m^{-2}$	25.49	31.49	28.35	34.69	33.22	30.57	30.61	30.02
d	0.95	0.93	0.94	0.91	0.92	0.93	0.93	0.93
N&S	0.81	0.72	0.77	0.66	0.69	0.73	0.73	0.74
<i>Daily Statistics</i>								
Mean, $W m^{-2}$	41.87	49.20	43.41	51.94	50.71	48.31	48.44	46.75
sd, $W m^{-2}$	23.87	29.27	26.77	28.96	28.49	28.56	28.54	27.95
m	0.93	1.04	1.01	0.97	0.99	1.03	1.04	1.02
r^2	0.71	0.60	0.68	0.54	0.57	0.62	0.62	0.64
RMSE, $W m^{-2}$	13.00	20.46	15.37	22.72	21.35	19.24	19.30	17.99
RMSE _s , $W m^{-2}$	2.17	8.76	2.93	11.46	10.23	7.85	7.98	6.28
RMSE _u , $W m^{-2}$	12.82	18.49	15.09	19.61	18.74	17.56	17.57	16.86
d	0.91	0.83	0.89	0.79	0.81	0.84	0.84	0.86
N&S	0.64	0.12	0.50	-0.09	0.04	0.22	0.22	0.32

Here, v stands for variable.

*Base equations with base S capacities.

†Base equations but $S = 0.5$ mm for all surfaces.

‡Coefficients [Falk and Niemczynowicz, 1978].

§Coefficients [Calder and Wright, 1985].

||Coefficients [Calder, 1977].

¶Coefficients [Shuttleworth, 1988].

measured E , but by the end of the study period they converge, indicating overprediction in the latter period. The same equation underpredicts the cumulative E when $S = 2.0$ mm but maintains a more similar slope to that of the measured E .

This indicates that care must be taken in assigning drainage functions and coefficients. It appears that those selected in this study for the Sunset site simulate the drainage and surface water state well.

7. DISCUSSION AND CONCLUSIONS

The objective of this study was not to model the evapotranspiration for a particular time and place but to develop a method to continuously model E over a range of meteorological conditions in urbanized terrain. There has been no attempt to calibrate the model to the measured data. Therefore the good performance of the model, using physically realistic input values obtained from the literature, allows us to recommend this type of approach to modeling urban evapotranspiration and surface water state in other cities.

Although the model does well on average it generally underpredicts in the early part of the year and performs better in the spring/early summer in Vancouver. The modeled Q_E is always greater than zero because dewfall is not predicted even though it was observed on grass on some nights. This failure is one of the reasons why the model underpredicts in the morning and should be corrected. The measured Q_E suggests that dewfall can be an important part

of the urban energy and water balances in these months and should not be ignored [Grimmond and Oke, 1986].

If the model is to be applied to other cities, the changes required primarily relate to the assignment of parameter values. From the sensitivity analyses it can be concluded that if the model is to operate well, close attention needs to be paid to the drainage and storage capacities of the dominant surface types. Wetness sensors, located on a number of representative surfaces, appear to be a simple way of assessing the performance of the model, since measurements of Q_E are not frequently available.

If the model is applied in other hydroclimatological regimes, for example, in a tropical city, it would be advisable to conduct evaporation measurements so that the surface resistance submodel is appropriate. The robustness of the surface resistance submodel has not been assessed elsewhere. In the tropics and other locations where intense rainfall events occur, further investigation of the Massman [1983] drainage functions, which allow for the inclusion of the intensity of rainfall, may be worthwhile. Snow has been ignored, but its incorporation via an additional submodel should be reasonably easy with the appropriate melt equations. The presence of frozen ground would require further adaptations since the model would have to keep a record of water phases as well as depth within a store.

We conclude that this physically based model is a promising approach to model evapotranspiration and surface water state in urban areas. It has the advantage of being

dynamically responsive to both meteorological and seasonal conditions. The success of the one layer form of the model suggests that developments to include a multilayer version are worthwhile. The performance of the whole-canopy approach to modeling the surface resistance is encouraging. The statistics indicate that it matches the results for forests, but the robustness of the parameters need to be tested in other urban areas.

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