# Wetropolis rainfall and flood demonstrator: hydraulic modelling, data assimilation, and control

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# 1 Introduction

Urban flooding is a major hazard worldwide, brought about by intense rainfall and often exacerbated by the built environment. The tabletop flood-demonstrator 'Wetropolis' illustrates in an idealised modelling environment how extreme hydroclimatic events can cause flooding of a city due to peaks in river levels and groundwater following intense rainfall. It aims to conceptualise the science of flooding in a way that is accessible to and directly engages the public and also provides a scientific testbed for flood modelling, control and mitigation, and data assimilation. As such, it is useful to the scientist, industrial practitioner, and general public.

Physically, it comprises a winding river channel with parallel canal, a reservoir for water storage, a porous flow cell (analogous to a moor) with observable groundwater flow, and random "rainfall", which may or may not lead to flooding in the idealised urban area of Wetropolis. The main river channel has three  $\pi$ -degree bends and one  $(\pi/4)$ -degree bend and is fed by water flowing into the domain at an upstream entry and leaving the domain at the downstream exit. The river bed is sloping down (uniformly with gradient 1 in 100); the river cross-sectional area is rectangular and uniform, and flanked on one side by a sloping flood plain outside of the urban area. Through the urban area, the rectangular channel is flanked on both sides by flat rectangular plains of higher elevation than the regular river channel, i.e.,

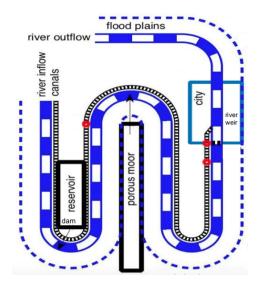


Figure 1: Plan view of Wetropolis showing the winding river channel... [Bokhove et al., 2019].

the cross-sectional area is T-shaped.

Water enters the main channel in three places: (i) the upstream inflow, generally kept constant; (ii) overflow of a groundwater cell (or "moor") with porous material and fed by random daily rainfall; and (iii) overflow from a reservoir or "lake", also fed by random daily rainfall. The two overflows can be placed in three different spots along the river: upstream, midstream or downstream just before the city plain. The set-up is displayed in plan-view in Fig. 1.

Rainfall is supplied randomly in space at four locations (reservoir, moor, reservoir and moor, or nowhere) and randomly in time at four rainfall amounts (1s, 2s, 4s, or 9s) during a 10s Wetropolis day (wd) via two skew-symmetric discrete probability distributions. The joint probabilities (rain amount times rain location) are determined daily as one of 16 possible outcomes from two asymmetric Galton boards, in which steel balls fall down every wd and according to the (imposed) discrete probability distributions. The most extreme daily rainfall event thus involves 9s rainfall on both moor and reservoir.

Its design is based on simulations of a one-dimensional numerical model of the dynamics that uses a kinematic approximation to describe the river flow and a depth-averaged nonlinear diffusion equation for the groundwater cell; a stochastic rainfall generator determines the amount and location of rain per wd. In order to create an extreme flood event in Wetropolis once every 5 to 10 minutes on average instead of, say, once every 100 to 200 years on average (as in reality)<sup>1</sup>, this preliminary modelling determined the length of the Wetropolis day to be 10s. Thus, Wetropolis is able to demonstrate random extreme rainfall and flood events in a physical model on reduced spatial and temporal scales (see Bokhove et al. [2019] for more details).

In Bokhove et al. [2019], a numerical model based on the equations for open channel flow (cf. Chanson [2004]) is used to determine the relevant time and length scales prior to its construction as a physical model. That is, it is a crude and inexpensive model suitable for design purposes. Here, we develop the hydrodynamic modelling further, both mathematically and numerically, with a view to conducting Wetropolis-inspired experiments in flood mitigation and control.

[More text and literature on control etc. See OneNote. [Breckpot, 2013; Breckpot et al., 2013; Vermuyten et al., 2017]... what is the end goal here? Emulators?]

# 2 Hydraulic model: from kinematic to St. Venant

#### 2.1 River model: open-channel flow

Examples of open channel flow include natural (e.g., rivers and streams) and man-made waterways (e.g., conduits, canals, drainage and sewer systems), in which water flows through channels of varying geometries with a free surface. Fluid mechanical modelling of such flows is termed hydraulic modelling and approximates the three-dimensional problem in a tractable, averaged approach (cf. Te Chow [1959]; Chanson [2004]). Unsteady open channel flow is typically modelled using the St. Venant equations in one (along-channel) spatial dimension. The key variables are: (i) the mean cross-sectional area A = A(s,t) [units m<sup>2</sup>] of the river

<sup>&</sup>lt;sup>1</sup>Conceptualising and communicating the notion of a return period, often misunderstood by non-specialists, was the main motivation for Wetropolis' design and construction.

channel, implicitly a function of the mean depth h = h(s, t) [units m] such that A = A(h, s); and (ii) the mean velocity u(s, t). The free surface height [units m] is then defined as the sum of the depth h and bed topography b = b(s) [units m] above zero. Fundamental assumptions of the St. Venant equations are (cf. Chanson [2004]):

- that the flow is hydrostatic, i.e., horizontal length and velocity scales well exceed their vertical counterparts such that vertical fluid accelerations are negligible;
- that flow is one-dimensional, i.e., the transverse free surface is horizontal and the velocity is uniform in a cross-section;
- that channel curvature is small and the bed slope is small, i.e., the angle  $\theta$  from the horizontal satisfies  $\cos \theta \approx 1$  and  $\theta \approx \sin \theta$ ;
- that sediment and bed motion are neglected.

Under the first assumption, the two-dimensional depth-averaged shallow water equations (SWEs) can be derived from the primitive equations of motion with horizontal coordinates x and y. The second assumption allows cross-sectional averaging of the two-dimensional SWEs; via the remaining assumptions, the St. Venant equations can be derived. Applications are naturally limited by these assumptions. Flow is non-hydrostatic where there are, e.g., turbulent dynamics, hydraulic jumps, and undular bores. The second assumption is not true in flows with cross-channel motions and also when there is no distinct channel or when multiple channels form. The third assumption does not hold when the channel bed is steep (e.g., mountain streams) or has sharp bends; meandering with a steep bed slope may lead to centrifugal forces acting on the flow, leading in turn to a sloping transverse profile and thereby violating the second assumption. The fourth assumption implies that the effects of sediment transportation on the flow are neglected; further, it does not hold when the channel shifts, e.g., due to erosion.

For the Wetropolis landscape, the spatial coordinate s follows the curved centreline of the main river channel (see Fig. 2). We denote partial derivatives with respect to space and time

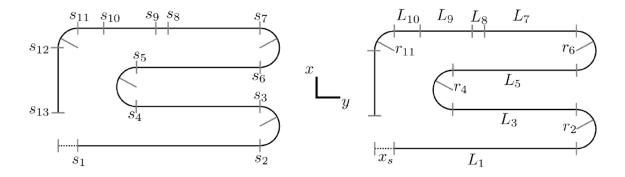


Figure 2: Parameterisation of the river channel in Wetropolis (see Fig. 1) using the along-channel spatial coordinate s. The channel is partitioned into 12 distinct sections  $S_i = (s_i, s_{i+1})$  of length  $L_i = |S_i|$  for i = 1, ..., 12. Radii of curved sections are denoted  $r_i$  and  $x_s$  is some shift value to move the start location of the river (s = 0).

as  $\partial(\cdot)/\partial s := \partial_s$  and  $\partial(\cdot)/\partial t := \partial_t$ , respectively; the basic St. Venant equations, cf. Chanson [2004]), which solve for the cross-sectional area A(s,t) and along-channel velocity u(s,t), are then

$$\partial_t A + \partial_s (Au) = S_A(s, t), \tag{1a}$$

$$\partial_t u + u \partial_s u + g \partial_s h - g \left( S_o - S_f \right) = 0, \tag{1b}$$

$$h = h(A(s, t), s), \tag{1c}$$

where  $S_A(s,t)$  is the mass source term [units m<sup>2</sup>s<sup>-1</sup>],  $S_o = -\partial_s b$  is the bed slope,  $S_f$  is the friction term [both dimensionless], and g is the gravitational acceleration [units ms<sup>-2</sup>]. Note that h appears in (1b) and is known via the (invertible) function (1c) and depends explicitly<sup>2</sup> on both A = A(s,t) and s. This system of equations, together with specified initial conditions, upstream and downstream boundary conditions, and lateral inflows, determines how the flow evolves in time. In Wetropolis, mass is added to the river system via random rainfall from the reservoir at  $s_{res}$  and the moor at  $s_{moor}$ , as well as from canal-1 at  $s_{1c}$ ; thus, the source

<sup>&</sup>lt;sup>2</sup>Note that explicit dependence on s is needed since  $h(A(s_1,t)) = h(A(s_2,t))$  does not imply  $s_1 = s_2$ . Otherwise said, the cross-sectional area at two locations may be the same, but the depth may differ depending on the channel geometry.

term is

$$S_A(s,t) = Q_{res}(t)\delta(s - s_{res}) + Q_{moor}(t)\delta(s - s_{moor}) + Q_{1c}(t)\delta(s - s_{1c})$$
(2)

where  $Q_{res}$ ,  $Q_{moor}$ ,  $Q_{1c}$  [units m<sup>3</sup>s<sup>-1</sup>] are the time-dependent inflows (which are determined by separate models for the reservoir, moor, and canal) at their respective locations, and  $\delta$ is the delta function<sup>3</sup>. [So the delta function carries a unit (or needs a prefactor) of m<sup>-1</sup> to reconcile  $S_A$  units m<sup>2</sup>s<sup>-1</sup> and Q (or Au) units m<sup>3</sup>s<sup>-1</sup>? Something is amiss here... or I am missing something? Is it because the delta function represents a *point source* so that a volume here is actually an area (volume with infinitesimal width)?] The friction term is typically modelled as a function of flow velocity u via the Manning relation:

$$S_f = \frac{C_m^2}{R^{4/3}} u |u|v \tag{3}$$

where  $R = R(h) = \frac{\text{wet area}}{\text{wetted perimeter}}$  [units m] is the hydraulic radius and  $C_m$  is the Manning friction coefficient. Typically,  $C_m \in [0.01, 0.15]$  is empirically derived with higher values meaning higher friction (e.g.,  $C_m = 0.01$  for flow over asphalt,  $C_m = 0.15$  for flow through a "rough" floodplain with trees and foliage); the units of  $C_m$  are  $m^{-1/3}$ s. Thus, combining these terms, the St. Venant equations (1) become

$$\partial_t A + \partial_s (Au) = S_A(s,t),$$
 (4a)

$$\partial_t u + u \partial_s u + g \partial_s h = -g \left( \partial_s b + \frac{C_m^2}{R^{4/3}} u |u| \right), \tag{4b}$$

$$h = h(A(s,t),s), \tag{4c}$$

with  $S_A(s,t)$  given by (2). The domain length is  $\sum_{j=1}^{12} L_j = L$  and we define  $L_{r1} = \sum_{j=1}^{7} L_j$  and  $L_{r2} = \sum_{j=1}^{9} L_j$  to be the channel length up to the city area and up to and including the

<sup>&</sup>lt;sup>3</sup>While the influx from the moor and reservoir will occur in two strips  $s_{moor} - \Delta_{moor}/2 < s < s_{moor} + \Delta_{moor}/2$  and  $s_{res} - \Delta_{res}/2 < s < s_{res} + \Delta_{res}/2$ , we have assumed  $\Delta_{moor}$  and  $\Delta_{res}$  to be small and therefore introduced the river entry points for simplicity via delta functions  $\delta(s - s_{moor})$  and  $\delta(s - s_{res})$ .

city area, respectively (see Fig. 2). When the continuity equation (4a) is integrated over the domain [0, L], we obtain

$$\frac{\mathrm{d}}{\mathrm{d}t} \int_{0}^{L} A \, \mathrm{d}s = Q_{res}(t) + Q_{moor}(t) + Q_{1c}(t) + Q_{s=0}(t) - Q_{s=L}(t), \tag{5}$$

with the (prescribed) inflow  $Q_{s=0}(t)$  at s=0 and the (resulting) outflow  $Q_{s=L}$  at s=L. For subcritical flow<sup>4</sup>, the inflow  $Q_{s=0}=(Au)\big|_{s=0}$  is given and the outflow set at  $Q_{s=L}=(Au)\big|_{s=L}$ . All Q-fluxes are expressed in m<sup>3</sup>s<sup>-1</sup> such that they match the units of the changing volume found on the LHS of (5).

#### 2.1.1 Kinematic model

When the dominant balance on the RHS of (4b) is between the Manning friction and the bed slope, we can ignore the LHS of (4b), in favour of a kinematic river flow model by using the velocity approximation (e.g., Munson et al. [2009]):

$$u = \frac{R^{2/3}}{C_m} \sqrt{-\partial_s b},\tag{6}$$

assuming that u remains positive. This is only valid for subcritical flow (i.e., flow velocity is less than the surface wave speed) and flow in which h(s,t) varies slowly. After substituting (6) into the continuity equation (4a), we obtain the kinematic model:

$$\partial_t A + \partial_s \left( \frac{AR^{2/3}}{C_m} \sqrt{-\partial_s b} \right) = S_A(s, t),$$
 (7)

with upwind information speed dQ(A)/dA > 0 for flux Q(A) = Au and inflow A(h(s = 0, t), s = 0). Since h = h(A(s, t), s), (7) is a scalar conservation law in the variable A. This kinematic model (7) has been used as an to determine suitable time- and length-scales efficiently for design purposes prior to construction of the physical Wetropolis set-up; see Bokhove et al. [2019]

<sup>&</sup>lt;sup>4</sup>Criticality of the flow concerns the ratio of flow velocity V to the surface (gravity) wave speed  $c_g$ , with  $c_g = \sqrt{gh}$  in rectangular channels. It is characterised by the (dimensionless) Froude number  $Fr = V/c_g$ , with Fr < 1 for subcritical flows and Fr > 1 for supercritical flows.

for more details. If one wishes to perform accurate predictions of the hydrodynamics in Wetropolis, then a more advanced models, e.g., the St. Venant equations, may be required.

#### 2.1.2 St. Venant equations in conservative form

By combining the mass (4a) and velocity equation (4b), the evolution equation for the momentum, or discharge, Au can be derived:

$$\partial_t(Au) + \partial_s\left(Au^2\right) + \underline{g}A\partial_s\underline{h} = -g\left(A\partial_sb + \frac{C_m^2Au|u|}{R^{4/3}}\right) + uS_A(s,t). \tag{8}$$

The conservative form (8) is often used (e.g., Bates et al. [2010]; Borsche [2015]; Hodges [2019]) for two reasons: (i) each term has a clear physical interpretation, and (ii) its structure is appealing from the perspective of finite volume and finite element numerical discretisations. From left to right, (8) can be interpreted as follows: the rate of change of the flow (i.e., discharge) is driven by nonlinear advection, the hydrostatic pressure gradient (via water depth), the gravity down the slope, frictional resistance, and finally any other external forcings.

Noting that the pressure term (underlined above in (8)) is in nonconservative form, it can be expressed (via application of the product rule) as follows:

$$A\partial_s h = \partial_s (Ah) - h\partial_s A. \tag{9}$$

This split is desirable because the Ah term is now in conservative form and the derivative no longer acts on h directly but on the dependent variable A = A(s, t). Substituting (9) into (8) yields the conservative form of the St. Venant equations (4):

$$\partial_t A + \partial_s (Au) = S_A(s, t), \tag{10a}$$

$$\partial_t(Au) + \partial_s \left( Au^2 + gAh \right) - \underline{gh}\partial_s \underline{A} = -g \left( A\partial_s b + \frac{C_m^2 Au|u|}{R^{4/3}} \right) + uS_A(s,t), \tag{10b}$$

where the nonconservative product has been underlined.

Hyperbolic systems of PDEs arise from physical phenomena involving wave motion and/or

advective transport. These systems have a rich mathematical structure and are the subject of a wealth of research from both an analytical (e.g., Whitham [2011]) and numerical (e.g., LeVeque [2002]) perspective. To show hyperbolicity and facilitate numerical implementation of the St. Venant system (10), we express it in the following vector form

$$\partial_t U + \partial_s F + G \partial_s U = S, \tag{11}$$

with vector of unknowns U = U(s, t), flux F, nonconservative product matrix G and source/sink vector S defined by

$$\mathbf{U} = (A, Au)^{T}, \quad \mathbf{F} = \mathbf{F}(\mathbf{U}) = (Au, Au^{2} + g h A)^{T},$$

$$\mathbf{G} = \mathbf{G}(\mathbf{U}) = \begin{pmatrix} 0 & 0 \\ -gh & 0 \end{pmatrix}, \quad \mathbf{S} = \mathbf{S}(\mathbf{U}) = \left(S_{A}, -gA\partial_{s}b - g\frac{C_{m}^{2}Au|u|}{R^{4/3}} + u S_{A}\right)^{T}. \quad (12)$$

The Jacobian matrix  $\mathbf{J} = \partial \mathbf{F}/\partial \mathbf{U} + \mathbf{G}$  for system (11) is then given by

$$\mathbf{J} = \begin{pmatrix} 0 & 1 \\ -u^2 + gA\partial h/\partial A & 2u \end{pmatrix}. \tag{13}$$

The eigenvalues of J are found to be

$$\lambda_{\pm} = u \pm \sqrt{gA \,\partial h/\partial A} \tag{14}$$

and since  $\partial h/\partial A$  is non-negative (see analysis and Figs. 4 and 6 in the following section), we conclude that the system is indeed hyperbolic. There exist novel numerical methods for integrating (nonconservative) hyperbolic systems of PDEs (11); we develop these further for (10) in section 3.

Table 1: Parameters, their units, and values used in Wetropolis' St. Venant system.

Parameter	Units	Value	Parameter	Units	Value
$h_r$	m	0.015	L	m	4.2
$h_f$	m	0.005	g	$\mathrm{ms}^{-2}$	9.81
$h_c$	m	0.02	$C_m$	${\rm m}^{-1/3}{\rm s}$	0.02
$w_r$	m	0.05	$\partial_s b$	-	-0.01
$w_f$	m	0.1	$s_m$	m	2.038
$w_c$	m	0.1	$s_r$	m	0.932

#### 2.2 River model: channel cross-sections

For the Wetropolis landscape and numerical modelling, we consider the invertible functions for the area A = A(h, s), water depth h = h(A, s), topography b = b(s) and hydraulic radius R = R(h, s) along (and as a function of) the spatial coordinate s. When the river water level is sufficiently low, water flows in a rectangular channel with cross-section  $A(h, s) = A(s,t) = w_r h(s,t)$  where  $w_r$  the (constant) channel width. In that case, the hydraulic radius is  $R(h,s) = \frac{w_r h}{2h+w_r}$ ; alternatively, as a function of area,  $R(A,s) = \frac{A}{2A/w_r+w_r}$ . When the water level exceeds the top of the rectangular channel, its cross-sectional area depends on its along-channel location s and whether s locates a flood plain or urban area (hence the explicit dependence of h and A on s throughout).

#### 2.2.1 Channel with flood plain

For the channel with a one-sided sloping flood plain, i.e., for  $s \in [0, L_{r1} + L_8/2] \cup [L_{r2} + L_{10}/2, L]$ , the cross-sectional area is given by:

$$A(h,s) = \begin{cases} w_r h & \text{when } h < h_r; \\ w_r h + \frac{1}{2} \frac{(h - h_r)^2}{\tan \alpha_r} & \text{when } h_r < h < h_r + h_f; \\ h(w_r + w_f) - w_f (h_r + \frac{1}{2} h_f) & \text{when } h > h_r + h_f; \end{cases}$$
(15a)

with  $h_r$  the main river channel depth,  $h_f$  the rise of the flood plain across its width  $w_f$ , so that  $\tan \alpha_r = h_f/w_f$  where  $\alpha_r$  is the angle of slope from horizontal of the flood plain (see Fig. 3). Alternatively, we can invert the above expression to obtain the water depth h as a

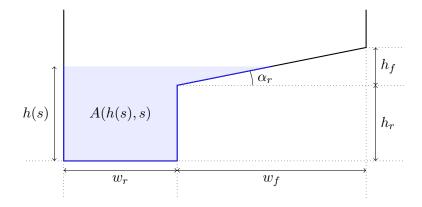


Figure 3: Schematic of the channel geometry with a one-sided sloping floodplain: the cross-sectional area A = A(h, s) (blue shaded area) with associated wetted perimeter W = W(h) (thick blue line), in this instance for  $h_r < h < h_r + h_f$  (see equations (15a)–(15c)). When  $h < h_r$ , the water flows in the rectangular channel of width  $w_r$ . Values of the physical Wetropolis channel are given in table 1.

function of cross-sectional area A:

$$h(A,s) = \begin{cases} A/w_r & \text{when } A < A_1; \\ h_r - w_r \tan \alpha_r + \sqrt{w_r^2 \tan \alpha_r^2 + 2(A - w_r h_r) \tan \alpha_r} & \text{when } A_1 < A < A_2; \\ \frac{(A + w_f (h_r + \frac{1}{2} h_f))}{w_r + w_f} & \text{when } A > A_2; \end{cases}$$

$$(15b)$$

with  $A_1 = w_r h_r$  and  $A_2 = (h_r + h_f)(w_r + w_f) - w_f(h_r + \frac{1}{2}h_f)$ . The hydraulic radius is calculated via R(h,s) = A(h,s)/W(h,s), where W is the wetted perimeter:

$$W(h,s) = \begin{cases} w_r + 2h & \text{when } h < h_r; \\ h + w_r + h_r + (h - h_r)\sqrt{1 + \frac{1}{\tan^2 \alpha_r}} & \text{when } h_r < h < h_r + h_f; \\ 2h + w_r - h_f + \sqrt{(h_f^2 + w_f^2)} & \text{when } h > h_r + h_f. \end{cases}$$
(15c)

Finally, since the eigenvalues (14) give wave speed information that is used in the numerical

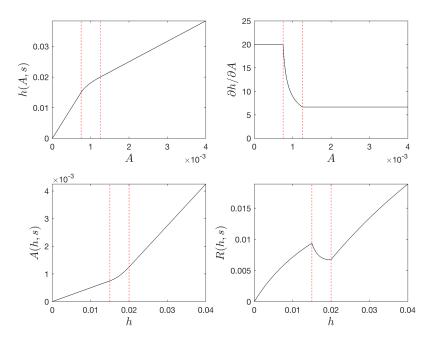


Figure 4: Functional relations for channel geometry with a floodplain ( $s \in \mathcal{L}_{fp}$ ; see Fig. 3). Top: h and  $\partial h/\partial A$  both as functions of area A (equations (15b) and (16)). Bottom: A and R both as functions of depth h (equations (15a) and R via (15c)). The dotted vertical lines correspond to the threshold areas  $A_1$  and  $A_2$  (top row) and threshold depths  $h_r$  and  $h_r + h_f$  (bottom row). Geometry parameters are given in table 1.

solver, we compute  $\partial h/\partial A$  from (15b) as follows:

$$\frac{\partial h}{\partial A}(A,s) = \begin{cases}
1/w_r & \text{when } A < A_1; \\
\frac{\tan \alpha_r}{\sqrt{w_r^2 \tan \alpha_r^2 + 2(A - w_r h_r) \tan \alpha_r}} & \text{when } A_1 < A < A_2; \\
\frac{1}{w_r + w_f} & \text{when } A > A_2.
\end{cases}$$
(16)

The functions defined above are plotted in Fig. 4 for the parameter values given in table 1. The domain is split into 3 regions according the area and depth thresholds; noteworthy is that all functions are continuous across the thresholds and  $\partial h/\partial A$  is positive for all A, thus confirming that the system is hyperbolic in this region (see previous section and wave-speeds in (14)).

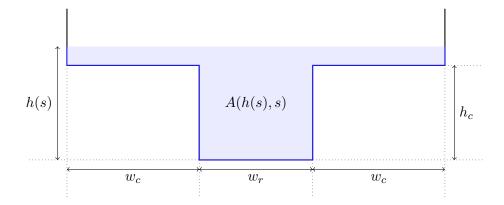


Figure 5: Schematic of the channel geometry in the urban area: the cross-sectional area A = A(h, s) (blue shading) with associated wetted perimeter W = W(h, s) (thick blue line), in this instance for  $h > h_c$  (see equations (17a)–(17c)). When  $h < h_c$ , the water flows in the rectangular channel of width  $w_r$ . Values of the physical Wetropolis channel are given in table 1.

#### 2.2.2 Channel through urban area

The channel in the urban area, i.e., for  $L_{r1} + L_8/2 < s < L_{r2} + L_{10}/2$ , is flanked by flat rectangular plains which are in turn flanked by vertical walls. Thus, the cross-sectional area is given by:

$$A(h,s) = \begin{cases} w_r h & \text{when } h < h_c; \\ (w_r + 2w_c)h - 2w_c h_c & \text{when } h > h_c; \end{cases}$$

$$(17a)$$

with  $w_c$  is the width of the flat plain (i.e., distance from the main channel to the vertical wall) and  $h_c > h_r$  is the river channel depth in the urban area (see Fig. 5). As before, we can invert the above expression to obtain the water depth h as a function of cross-sectional area A:

$$h(A,s) = \begin{cases} A/w_r & \text{when } A < A_c; \\ \frac{A+2w_ch_r}{w_r+2w_c} & \text{when } A > A_c; \end{cases}$$
 (17b)

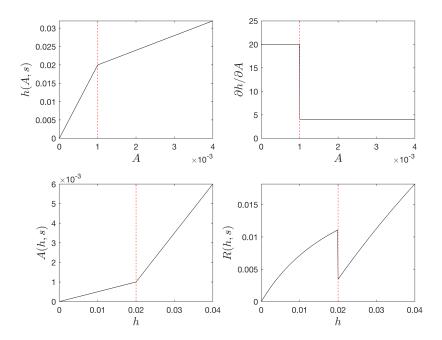


Figure 6: Functional relations for channel geometry in the urban area ( $s \in \mathcal{L}_u$ ; see Fig. 5). Top: h and  $\partial h/\partial A$  both as functions of area A (equations (17b) and (18)). Bottom: A and R both as functions of depth h (equations (17a) and R via (17c)). The dotted vertical lines correspond to the threshold area  $A_c$  (top row) and threshold depth  $h_c$  (bottom row). Channel geometry parameters are given in table 1.

with  $A_c = w_r h_c$ . As before, the hydraulic radius is calculated via R(h, s) = A(h, s)/W(h, s) where W is the wetted perimeter:

$$W(h,s) = \begin{cases} w_r + 2h & \text{when } h < h_c; \\ w_r + 2w_c + 2h & \text{when } h > h_c. \end{cases}$$
 (17c)

Finally, from (17b),  $\partial h/\partial A$  is given by:

$$\frac{\partial h}{\partial A}(A,s) = \begin{cases} 1/w_r & \text{when } A < A_c; \\ \frac{1}{w_r + 2w_c} & \text{when } A > A_c. \end{cases}$$
 (18)

The functions defined above for the urban area-cross sections are plotted in Fig. 6 for the parameter values given in table 1. The domain is split into 2 regions according the area

and depth thresholds; sharper transitions across the thresholds mean that h = h(A, s) and A = A(h, s) are continuous but the derivative  $\partial h/\partial A$  and hydraulic radius R(h, s) are not. However,  $\partial h/\partial A$  remains positive, again confirming that the system is hyperbolic in this region (see previous section and (14)).

#### 2.2.3 Transition between floodplain and urban area

[Implemented in code: linear transition from floodplain to city by increasing  $h_r$  to  $h_c$  over a given length.]

#### 2.2.4 Simplifications

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To simplify matters and to avoid the sudden cross-sectional area changes through the section  $L_9$  and  $L_{10}$  in Wetropolis, see Fig. 1, we only use the one cross-sectional river shape but make  $h_f = h_f(s)$ ,  $w_f = w_f(s)$  and  $h_r = h_r(s)$  smooth functions of s. We also rework R(A, h(A, s), s) = R(A, s). We therefore adapt the above expressions as follows

$$A(h,s) = \begin{cases} w_r h & h < h_r \\ w_r h + \frac{1}{2}(h - h_r)^2 / \tan \alpha_r & h_r < h < h_r + h_f \\ h(w_r + w_f) - w_f (h_r + \frac{1}{2}h_f) & h > h_r + h_f \end{cases}$$
(19a)

$$h(A,s) = \begin{cases} A/w_r & A < A_1 \\ h_r + \sqrt{w_r^2 \tan \alpha_r^2 - 2w_r h_r \tan \alpha_r + 2A \tan \alpha_r} - w_r \tan \alpha_r & A_1 < A < A_2 \\ \frac{(A+w_f(h_r + \frac{1}{2}h_f))}{(w_r + w_f)} & A > A_2 \end{cases}$$
(19b)

$$W(A,s) = \begin{cases} w_r + 2A/w_r & A < A_1(s) \\ (\sqrt{w_r^2 \tan \alpha_r^2 - 2w_r h_r \tan \alpha_r} + 2A \tan \alpha_r - w_r \tan \alpha_r) \times \\ (1 + \sqrt{1 + 1/\tan \alpha_r^2}) + w_r + 2h_r & A_1(s) < A < A_2(s) \\ \frac{2(A + w_f (h_r + \frac{1}{2}h_f))}{(w_r + w_f)} + w_r - h_f + \sqrt{(h_f^2 + w_f^2)} & A > A_2(s) \end{cases}$$

for  $s \in [0, L]$  with  $\tan \alpha_r = h_f(s)/w_f(s)$ , with  $A_1(s) = w_r h_r(s)$ ,  $A_2(s) = (h_r(s) + h_f(s))(w_r + w_f(s)) - w_f(s) (h_r(s) + \frac{1}{2}h_f(s))$  and

$$h_{f}(s) = \frac{1}{2} h_{f1} \left( 2 - \tanh \left( a_{s}(s - L_{r1}) \right) - \tanh \left( a_{s}(L_{r2} + L_{10} - s) \right) \right)$$

$$- \frac{1}{2} h_{f0} \left( \tanh \left( a_{s}(L_{r1} - s) \right) + \tanh \left( a_{s}(s - L_{r2} - L_{10}) \right) \right), \qquad (19c)$$

$$w_{f}(s) = \frac{1}{2} w_{f0} \left( 2 - \tanh \left( a_{s}(s - L_{r1}) \right) - \tanh \left( a_{s}(L_{r2} + L_{10} - s) \right) \right)$$

$$- w_{city} \left( \tanh \left( a_{s}(L_{r1} + L_{8} - s) \right) + \tanh \left( a_{s}(s - L_{r2}) \right) \right) \qquad (19d)$$

$$h_{r}(s) = h_{r0} + \frac{(h_{wall} - h_{r0})}{2} \left( 1 + \cos(\pi(s - L_{R1})/l_{fac}) \right) \Theta(s - L_{R1} + l_{fac}) \Theta(L_{R1} - s)$$

$$+ \left( h_{rc} - h_{r0} \right) \Theta(s - L_{R1} - l_{fac}) \Theta(L_{R2} + L_{10} - l_{fac} - s)$$

$$+ \left( h_{rc} - h_{r0} + \frac{(h_{wall} - h_{rc})}{2} \left( 1 + \cos(\pi \left( \frac{s - L_{R2} - L_{10}}{l_{fac}} \right) \right) \right) \Theta(s - L_{R1}) \Theta(L_{R1} + l_{fac} - s)$$

$$+ \frac{\left( h_{rc} - h_{r0} + (H_{wall} - h_{rc})}{2} \left( 1 + \cos(\pi \left( \frac{s - L_{R1}}{l_{fac}} \right) \right) \right) \Theta(s - L_{R1}) \Theta(L_{R1} + l_{fac} - s)$$

$$+ \frac{(h_{wall} - h_{r0})}{2} \left( 1 + \cos(\pi(s - L_{R2} - L_{10})/l_{fac}) \right) \Theta(s - L_{R2} - L_{10}) \Theta(L_{R2} - L_{10} - s)$$

$$(19e)$$

with, e.g.,  $h_{f1} = 0.02$ m,  $h_{fc} = 0.025$ m,  $w_{f0} = 0.1$ m,  $w_{city} = 0.12$ m,  $h_{r0} = 0.15$ m,  $h_{rc} = 0.02$ m,  $h_{wall} = 0.04$ m and a smoothing parameter, e.g.,  $a_s = 100$  or  $a_s = 200$ . In addition, we rewrite (??) as

$$R(A,s) = A/W(A,s). (20)$$

[Note: this approach with steep and thus large  $a_s = 100, 200$  still seems to give a numerical, artificial peak at the end of the city. It may be an idea to let  $h_r(s)$  go up to wall height from

its flood-plain-channel height and then to its city height via a berm, thus mimicking the actual finite surrounding wall height in the physical Wetropolis model.

#### 2.3 Groundwater, canal, and reservoir model

As established in (2), water enters the river channel at moor  $s = s_{moor}$  and reservoir  $s = s_{res}$  at time-dependent rates  $Q_{moor}(t)$  and  $Q_{res}(t)$ . These rates are determined by models for the groundwater cell (moor) and reservoir (recall Fig. 1), which have been developed in Bokhove et al. [2019] and are coupled here to the St. Venant model for the river dynamics.

#### 2.3.1 Groundwater model

Consider the width-averaged nonlinear diffusion equation modelling groundwater flow in a channel (Barenblatt 1996)

$$\partial_t(w_v h_m) - \alpha g \partial_v(w_v h_m \partial_v h_m) = w_v R / (m_{por} \sigma_e)$$
(21)

with groundwater level and variable  $h_m = h_m(y,t)$  [L] above a horizontal datum z = 0, channel width  $w_v \approx 0.1$ m, acceleration of gravity g = 9.81m/s<sup>2</sup> [L/T<sup>2</sup>], derivative  $\partial_y$  in the along-channel direction  $y \in [0, L_y]$  of a cell of length  $L_y \approx 0.85$ m [L], porosity  $m_{por} \in [0.1, 0.3]$ , given rainfall R = R(t) [L/T], the fraction of a pore  $\sigma_e \in [0.5, 1]$  that can be filled with water due to residual air, factor

$$\alpha = k/(\nu m_{por} \sigma_e) \tag{22}$$

with permeability  $k \in [10^{-8}, 10^{-9}] \text{m}^2$  [ $L^2$ ] and viscosity of water  $\nu = 10^{-6} \text{m}^2/\text{s}$  [ $L^2/T$ ]. Boundary conditions are no flow at  $y = L_y$  such that

$$\partial_u h_m = 0 \tag{23}$$

and a Dirichlet condition at y = 0, the other channel end, equal to the water level  $h_{cm}(t)$  in a short outflow canal

$$h_m(0,t) = h_{cm}(t).$$
 (24)

The initial condition is  $h_m(y,0) = h_{m0}(y)$ . Make a sketch of the situation. The assumptions are that the groundwater level stays underground thus not inducing any surface run-off and that the flow is hydrostatic, with variations in the horizontal y-direction much longer than the vertical length scales. The canal level  $h_{cm}(t)$  holds in a short channel of length  $L_c$  between  $-L_c < y < 0$  with a weir at  $y = -L_c$ . The water level at the weir is critical, meaning that the flow speed  $V_c = \sqrt{gh_c}$  is critical at  $y = -L_c$ . Assuming stationarity and by using Bernoulli's equation to link the speed and water depth  $\{V_{cm}, h_{cm}\}$  in the channel to that at the weir  $\{V_c, h_c\}$  one obtains that

$$gh_{cm} + \frac{1}{2}V_{cm}^2 = gh_c + \frac{1}{2}V_c^2 = \frac{3}{2}gh_c \Longrightarrow h_c = \frac{2}{3}h_{cm}$$
 (25)

assuming in addition that  $V_{cm}^2 \ll gh_{cm}$ . The critical flux is therefore (see, e.g., Munson et al. 2005):

$$Q_c = w_v h_c V_c = w_v \sqrt{g} \max(2h_{cm}/3, 0)^{3/2}.$$
 (26)

To obtain further insight, we rewrite and analyse (21) next. The groundwater equation is clearly a continuity equation

$$\partial_t(w_v h_m) + \partial_y(v h_m) = \frac{w_v R}{m_{por} \sigma_e}$$
(27)

with the Darcy velocity

$$v = -\frac{kg}{\nu m_{por}\sigma_e} \partial_y(w_v h_m) \tag{28}$$

and Darcy flux

$$Q \equiv w_v q \equiv w_v h_m v = -w_v h_m \frac{\kappa}{\mu} \partial_y p = -w_v h_m \frac{\kappa}{\nu \rho_0} \partial_y p$$

$$\approx -\frac{\kappa g}{\nu} \partial_y h_m = -w_v h_m \frac{kg}{\nu m_{nor} \sigma_e} \partial_y h_m = -w_v \alpha g \partial_y \left( h_m^2 / 2 \right)$$
(29)

with density of water  $\rho_0$  and where we used the hydrostatic approximation and depthintegration to the free surface at  $z = h_m$  by using  $\partial_y p/\rho_0 \approx g\partial_y h_m$ . The first and last term in (21) display the water balance as follows, in the case that there is no y-dependence:

$$\partial_t h_m = R/(m_{por}\sigma_e). \tag{30}$$

Hence, for  $h_m$  zero initially and constant rainfall, we find  $h_m = tR/(m_{por}\sigma_e)$  showing that for  $m_{por} = \sigma_e = 1$  unity the groundwater level rises directly with rainfall, while it rises faster for general  $m_{por} < 1$  and  $\sigma_e < 1$ , showing that the modelling of rainfall supply is consistent. Hence, the canal level is modelled by the outflow at  $y = -L_c$  and inflow at y = 0 as follows

$$L_c w_v \frac{\mathrm{d}h_{cm}}{\mathrm{d}t} = m_{por} \sigma_e Q_0 - Q_c \equiv w_v m_{por} \sigma_e \frac{1}{2} \alpha g \partial_y (h_m^2)|_{y=0} - w_v \sqrt{g} \max\left(\frac{2}{3} h_{cm}(t), 0\right)^{3/2}.$$

In summary, the complete mathematical groundwater model is:

$$\partial_t(w_v h_m) - \alpha g \partial_y(w_v h_m \partial_y h_m) = \frac{w_v R}{m_{por} \sigma_e} \quad \text{in} \quad y \in [0, L_y]$$
(31)

$$\partial_y h_m = 0 \quad \text{at} \quad y = L_y$$
 (32)

$$h_m(0,t) = h_{cm}(t) \quad \text{at} \quad y = 0 \tag{33}$$

$$L_c w_v \frac{\mathrm{d}h_{cm}}{\mathrm{d}t} = w_v m_{por} \frac{\sigma_e}{2} \alpha g \partial_y (h_m^2)|_{y=0} - w_v \sqrt{g} \max \left(\frac{2}{3} h_{cm}(t), 0\right)^{3/2}$$
(34)

plus initial conditions for  $h_m$  and  $h_{cm}$ . The multiplication by  $m_{por}\sigma$  accommodates the flow out of the groundwater matrix into open space (?), while the y-derivative of  $h_m^2$  has been taken rather than using  $h_m \partial_y h_m$  as otherwise a simple explicit discretisation with  $h_m(0,0) = 0$  is

and  $h_{cm}(0) = 0$  will not lead to water flux into the canal.

## 2.4 Summary of overall model

From Bokhove et al. [2019]: The fully coupled system of river, moor and reservoir, including its initial and boundary conditions, for the unknowns A(s,t), u(s,t),  $h_m(y,t)$ ,  $h_{res}(t)$ ,  $h_{1c}(t)$ ,  $h_{2c}(t)$  and  $h_{3c}(t)$  is as follows [Bokhove et al., 2019] [TO DO: check for consistency... new groundwater model and coupling]:

River: 
$$\begin{cases} \partial_t A + \partial_s (Au) = S_A \\ \partial_t (Au) + \partial_s (Au^2) + gA\partial_s h = -g\left(A\partial_s b + \frac{C_m^2 Au|u|}{R^{4/3}}\right) + uS_A \end{cases}$$
 on  $s \in [0, L]$ 

with 
$$h = h(A(s,t)), h(s,0) = h_0(s), u(s,0) = u_0(s)$$
 (35a)

Moor: 
$$\partial_t(w_v h_m) - \alpha g \partial_y (w_v h_m \partial_y h_m) = \frac{w_v R_m(t)}{m_{por} \sigma_e}$$
 on  $y \in [0, L_y]$ 

with 
$$\partial_t h_m|_{y=L_y} = 0$$
,  $h_m(0,t) = h_{3c}(t)$ ,  $h_m(y,0) = h_{m0}(y)$  (35b)

Reservoir: 
$$w_{res}L_{res}\frac{\mathrm{d}h_{res}}{\mathrm{d}t} = w_{res}L_{res}R_{res}(t) - Q_{res}$$
, with  $h_{res}(0) = h_{r0}$  (35c)

Canal-1: 
$$w_c(L_{1c} - L_{2c}) \frac{\mathrm{d}h_{1c}}{\mathrm{d}t} = Q_{2c} - Q_{1c}$$
, with  $h_{1c}(0) = h_{10}$  (35d)

Canal-2: 
$$w_c(L_{2c} - L_{3c}) \frac{dh_{2c}}{dt} = Q_{3c} + \frac{1}{2} \gamma m_{por} w_v \alpha g \partial_y(h^2)|_{y=0} - Q_{2c}$$
, with  $h_{2c}(0) = h_{20}$  (35e)

Canal-3: 
$$w_c L_{3c} \frac{dh_{3c}}{dt} = \gamma Q_{tm} - Q_{3c}$$
 with  $h_{3c}(0) = h_{30}$ , (35f)

Influxes: 
$$Q_{1c} = C_f \sqrt{g} w_c \max(h_{1c} - P_{1w}, 0)^{3/2}$$
 (35g)

$$Q_{2c} = C_f \sqrt{g} \, w_c \, \max(h_{2c} - P_{2w}, 0)^{3/2}$$
(35h)

$$Q_{3c} = C_f \sqrt{g} \, w_c \, \max(h_{3c} - P_{3w}, 0)^{3/2}$$
(35i)

$$Q_{moor} = (1 - \gamma)Q_{tm} \equiv \frac{1}{2}(1 - \gamma)m_{por}\sigma_e W_v \alpha g(\partial_y h_m)^2|_{y=0}$$
(35j)

$$Q_{res} = C_f \sqrt{g} \, w_{res} \, \max(h_{res} - P_{wr}, 0)^{3/2}$$
(35k)

as well as hydraulic radius R(h), specified inflow  $Q_0(t) = (Au)\big|_{s=0}$ , and time-dependent rainfall functions  $R_{res}(t)$ ,  $R_m(t)$ . [Canal-3 incorrect in wetro article?]. The remaining parameters are constants, with units and typical values listed in Table 1. The rainfall functions are de-

fined such that, in the absence of other effects, e.g. unit porosity in the moor, they directly lead to a linear increase of the moor's ground water level and the reservoir depth.

## 3 Numerical model

## 3.1 River model

Recall the nonconservative system  $\partial_t \mathbf{U} + \partial_s \mathbf{F} + \mathbf{G} \partial_s \mathbf{U} = \mathbf{S}$  with vector of unknowns  $\mathbf{U} = \mathbf{U}(s,t)$ , flux  $\mathbf{F}$ , nonconservative product matrix  $\mathbf{G}$  and source/sink vector  $\mathbf{S}$  defined by

$$\mathbf{U} = (A, Au)^{T}, \quad \mathbf{F} = \mathbf{F}(\mathbf{U}) = (Au, Au^{2} + g h A)^{T},$$

$$\mathbf{G} = \mathbf{G}(\mathbf{U}) = \begin{pmatrix} 0 & 0 \\ -gh & 0 \end{pmatrix}, \quad \mathbf{S} = \mathbf{S}(\mathbf{U}) = \left(S_{A}, -gA\partial_{s}b - g\frac{C_{m}^{2}Au|u|}{R^{4/3}} + u S_{A}\right)^{T}.$$
 (36)

The space-discretisation (cf. Rhebergen et al. [2008]; Kent et al. [2017]; Kent and Bokhove [2019]) for this nonconservative system is as follows. We define a mesh on  $x \in [0, L]$  with  $N_{el}$  cells, nodes  $x_k$  with  $k = 1, \ldots, N_k + 1$  and cell widths  $|K_k| = x_{k+1} - x_k$ . Instead of the exact Riemann problem, this Godunov-type approach (cf. LeVeque [2002]) uses approximate values of the information speeds  $S^{L,R}$ 

$$S^{L} = \min\left(u^{L} - \sqrt{gA^{L}\partial h(A^{L}, s)/\partial A^{L}}, u^{R} - \sqrt{gA^{R}\partial h(A^{R}, s)/\partial A^{R}}\right) \quad \text{and}$$

$$S^{R} = \max\left(u^{L} + \sqrt{gA^{L}\partial h(A^{L}, s)/\partial A^{L}}, u^{R} + \sqrt{gA^{R}\partial h(A^{R}, s)/\partial A^{R}}\right)$$
(37)

in order to determine the numerical fluxes  $\mathcal{P}^{p,m}$  in the following space-discretised scheme:

$$|K_k| \frac{\mathrm{d}\bar{U}_k}{\mathrm{d}t} = -\mathcal{P}^p(\bar{U}_{k+1}^-, \bar{U}_{k+1}^+) + \mathcal{P}^m(\bar{U}_k^-, \bar{U}_k^+) + |K_k| S_k(\bar{U}_k). \tag{38}$$

The numerical fluxes are computed as follows:

$$\mathcal{P}_i^p(\bar{U}_{k+1}^-, \bar{U}_{k+1}^+) = \mathcal{P}_i^{NC} + \frac{1}{2} \int_0^1 G_{ij}(\phi) \frac{\partial \phi_j}{\partial \tau} d\tau$$
(39a)

$$\mathcal{P}_i^m(\bar{U}_k^-, \bar{U}_k^+) = \mathcal{P}_i^{NC} - \frac{1}{2} \int_0^1 G_{ij}(\phi) \frac{\partial \phi_j}{\partial \tau} \, d\tau, \tag{39b}$$

$$\mathcal{P}_{i}^{NC}(U^{L}, U^{R}) = \begin{cases}
F_{i}^{L} - \frac{1}{2} \int_{0}^{1} G_{ij}(\phi) \frac{\partial \phi_{j}}{\partial \tau} d\tau, & \text{if } S^{L} > 0; \\
F_{i}^{HLL} - \frac{1}{2} \frac{S^{L} + S^{R}}{S^{R} - S^{L}} \int_{0}^{1} G_{ij}(\phi) \frac{\partial \phi_{j}}{\partial \tau} d\tau, & \text{if } S^{L} < 0 < S^{R}; \\
F_{i}^{R} + \frac{1}{2} \int_{0}^{1} G_{ij}(\phi) \frac{\partial \phi_{j}}{\partial \tau} d\tau, & \text{if } S^{R} < 0;
\end{cases} \tag{39c}$$

$$F_i^{HLL} = \frac{F_i^L S^R - F_i^R S^L + S^L S^R (U_i^R - U_i^L)}{S^R - S^L},$$
(39d)

where we have suppressed the vector index i = 1, 2 of  $(\bar{U}_k)_i$  for ease of notation. Using a linear path  $\phi_1 = A_L + \tau(A_R - A_L)$  and low-order numerical Gaussian quadrature for the integration, we find that

$$\int_{0}^{1} G_{21} \frac{\partial \phi_{1}}{\partial \tau} d\tau = -g \int_{0}^{1} h \left( A_{L} + \tau (A_{R} - A_{L}), s \right) \left( A_{R} - A_{L} \right) d\tau$$

$$\approx -\frac{1}{2} g (A_{R} - A_{L}) \left( h \left( A_{L} + \frac{1}{2} (1 - 1/\sqrt{3}) (A_{R} - A_{L}), s \right) + h \left( A_{L} + \frac{1}{2} (1 + 1/\sqrt{3}) (A_{R} - A_{L}), s \right) \right). \tag{40}$$

Since the dependency of h(A, s) on s has been enforced previously to be continuous, we can use the value of s at the relevant node in this integral expression.

[Add: initial, boundary data and point source delta functions.]

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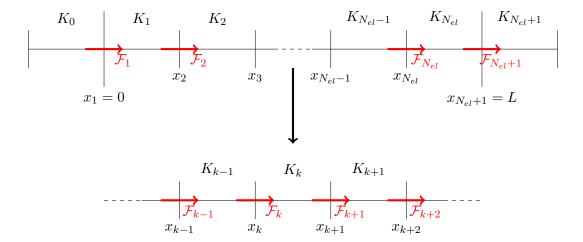


Figure 7: The computational mesh is extended to include a set of ghost elements  $K_0$  and  $K_{N_{el}+1}$  to enforce boundary conditions. Central to the DGFEM/FV schemes are the numerical fluxes  $\mathcal{F}$  through the nodes, which in this case are given by  $\mathcal{P}^{p,m}$  (see eqs. (38) and (39)). For DG0/FV simulations, model variables are projected on to each element  $K_k$  as piecewise constant functions, and may be discontinuous across nodes. For DG1 simulations (not shown here), the piecewise linear approximation is used, also discontinuous across nodes.

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