Modeling urban floods at sub-meter resolution: challenges or opportunities for flood risk management?

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9 Abstract

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In this article we investigate the influence of fine scale changes in the elevation 10 of urban terrains on the dynamics and final distribution of flood inundation 11 generated by intense rainfall. Numerical experiments have been performed 12 combining 2D shallow-water model with extremely fine resolution (10 cm) 13 terrain data. Our results reveal that localized, decimetric-scale alterations 14 in the elevation of streets can lead to remarkable differences in the flood 15 inundation. These results confirm the important role played by finely resolved 16 and accurate terrain data in capturing flow patterns that have a central 17 impact on model predictions of flood inundation. Also, we argue that the 18 observed sensitivity of flood inundation to small-scale topographical features 19 paves the way to new opportunities for flood risk management measures. 20 In particular, engineering flood resilient urban surfaces using fine resolution 21 models has a potential to considerably reduce flood impacts at a relatively 22 low cost. 23

²⁴ Keywords: urban flood, modelling, terrestrial LiDAR

25 1. Introduction

It is an unfortunate and often tragic combination of factors that places urban flooding amongst the most damaging and costly of all natural hazards. Worldwide, a relatively frequent occurrence of heavy rainfall storms combine with high levels of human exposure and high-value and vulnerable assets to produce multi-billion losses every year. In a world of rapid urbanization and considering the prospect of strongly adverse climate change effects, understanding and mitigating urban flood risks is eliciting widespread concern and
has become an issue of the highest priority.

Among different sources of flooding that can occur in urban areas (e.g. 34 river, coastal, groundwater), surface water flooding (i.e. flood resulting from 35 intense excess rainfall) is often responsible for a significant proportion of 36 flood losses. For instance, the Environment Agency of England and Wales 37 estimates that 3.8 million properties are at risk of surface flooding (EA, 2009)38 in England and Wales. A drastic example of this exposure occurred during 30 the summer of 2007, when approximately two thirds of the 55,000 damaged 40 properties were flooded by surface water (*DEFRA*, 2008; *Evans et al*, 2008). 41 In spite of the relevance to current and future generations, a comprehensive 42 understanding of the dynamics of surface water urban inundation, as well 43 as the development of methods to accurately model and mitigate its conse-44 quences are still in their infancy when compared to the substantial progress 45 achieved over decades of research in river and coastal flooding. While models 46 of sewerage systems date back to the early 70's (Delleur, 2003), the devel-47 opment and application of the first coupled sewer-surface flow models only 48 emerged during the first decade of the 21st century (*Djordjevic et al*, 1999). 49 In addition, prevention and mitigation of urban flooding has historically been 50 limited in scope, and almost exclusively linked to the appropriate design and 51 sizing of the sewerage system, a vision that has only recently been broad-52 ened to include the concepts of Sustainable Drainage Systems (SuDS). Little 53 attention has been given to a thorough understanding of the role played by 54 urban topography (in particular sub-meter scale) on the behavior of floods. 55 This is despite the fact that under medium to extreme rainfall events (when 56 the sewer system is usually surcharged) most of the flood water is expected 57 to be carried as overland flow (e.g. Mark et al, 2004; Mignot et al, 2006), in 58 which case the layout of surface pathways will largely dictate what areas of 59 the urban terrain will be inundated. 60

Even though during intense rainfall events large parts of urban areas may 61 be exposed to relatively high flow depths, this usually occurs as a result of the 62 accumulation (in terrain depressions or lowland areas) of water previously 63 routed from the urban catchment along roads and other flow paths. The 64 transport of surface flow along these pathways is a phenomenon of shallow 65 water (i.e. typically < 20 cm deep) that can move at relatively high velocities. 66 This type of flow is controlled by small-scale features of the urban terrain such 67 as the height of curbs, the shape and dimensions of road cambers, as well as by 68

the connectivity of roads and pathways. The road network can be particularly 69 efficient in transporting water across the urban domain and therefore plays 70 an important role in the ultimate distribution of flooded areas. Capturing 71 the effects of these elements in a two dimensional (2D) model requires very 72 fine resolution topography (i.e. sub-meter resolution, as discussed in Ozdemir 73 et al, 2013), which translates into extremely high computational times that 74 are often unfeasible in most practical applications. This results from the 75 fact that the computational time of explicit two-dimensional models usually 76 used for flood simulations scales with the resolution of the mesh raised to the 77 power of three. For instance, refining a mesh from 1 m to 10 cm translates 78 into a $1000 \times$ increase in the simulation time. 79

As a response to the above computational barrier, a number of practical 80 modeling abstractions and simplifications have emerged, which attempt to 81 overcome this limitation and to achieve simulation run times that are com-82 patible with available computational resources. Particular efforts have been 83 devoted to models that conceptualize the surface component of urban floods 84 as a set of elements such as small catchments and/or ponds that are inter-85 connected by 1D channels that represent the road network (e.g. Mark et al, 86 2004; Nasello and Tucciarelli, 2005; Maksimovic et al, 2009; Leandro et al., 87 2009), in a similar way to the first river network models of the late 1970's (e.g. 88 Cunge, 1980). The coupling of this representation of the surface flow with a 89 sewerage network model is often described as a 1D-1D model, as opposed to 90 the 2D-1D approach, in which a two dimensional model is used to simulate 91 the overland component of the flow. Some of the limitations of the 1D rep-92 resentation of surface flow (such as the dependency on user-defined schemes, 93 such as 1D network of pathways and storage elements) have been previously 94 exposed (Mark et al, 2004; Leandro et al., 2009), while other aspects related 95 to the upscaling of sub-meter features remain largely unknown. 96

Two-dimensional models used in urban flooding are usually based on the 97 shallow water equations (Mignot et al, 2006; Bazin et al, 2014), and sim-98 plified forms of these equations such as the zero inertial (e.g. Nasello and 99 Tucciarelli, 2005; Leandro et al., 2009) and local inertial approximations (e.g. 100 Aronica and Lanza, 2005; Fang and Su, 2005; Bates et al, 2010; de Almeida et 101 al, 2012; de Almeida and Bates, 2013), or even simpler formulations (Samp-102 son et al, 2012), have also been widely adopted to speed up simulations. 103 Another strategy to reduce the computational burden of 2D models focuses 104 on defining sub-grid abstractions that resolve some of the complexities of 105 the urban relief, which is modeled at coarse resolution (e.g. $10 \sim 100m$). 106

Among this type of models, those adopting the concept of porosity to de-107 scribe urban features such as buildings have attracted significant attention 108 (e.g. Molinaro et al, 1994; Sanders et al, 2008; Soares-Frazao et al, 2008; 109 Guinot, 2012 to cite but a few). While this approach correctly represents 110 some of the physics operating at intermediate resolution scales (such as the 111 influence of buildings on mass and momentum conservation, which is gov-112 erned by building dimensions and spacings) and perform well in representing 113 catastrophic flood events (e.g. dam-break induced), it lacks the ability to 114 capture wetting and drying, blockage and other directional effects that are 115 governed by considerably fine scale topographical features. 116

To date, two dimensional modeling of urban floods has been performed 117 almost exclusively using digital elevation models (DEMs) with resolutions of 118 1 m or coarser (e.g. Mark et al, 2004; Fang and Su, 2005; Aronica and Lanza, 119 2005; Gallegos et al. 2009; Leandro et al., 2009; Maksimovic et al. 2009; Gal-120 lien et al, 2011; de Almeida et al, 2012). Advances in computational resources 121 and methods combined with the recent availability of sub-meter resolution 122 terrestrial LiDAR data have enabled the first two-dimensional simulations of 123 urban inundation to be performed at resolutions as low as 10 cm (Ozdemir 124 et al, 2013). These extremely fine resolution simulations have shown that 125 differences in model predictions persist even as the mesh resolution is re-126 fined from 50 cm to 10 cm. Implicit to this dependency of simulation results 127 on mesh resolution are two different albeit interrelated issues. Firstly, the 128 shape of different terrain features are degraded as the resolution is coars-129 ened, which particularly affects the flow conveyance of road cambers and the 130 storage capacity of different elements (e.g. depression storage). Secondly, 131 and arguably more importantly for shallow water flows, is the fact that the 132 elevation of local peaks are closely approximated at fine resolution, but are 133 in general underestimated at coarser resolution as a result of the increased 134 average distance from the peaks to sampled points. For example, considering 135 a road camber with average cross slope of 4%, the maximum error introduced 136 to the vertical position of the crown by a 5 m resolution sampling is 10 cm. 137 This is of the same order of magnitude as typical flood depths that are ob-138 served at road networks, and is expected to allow the model to incorrectly 130 route water along directions that would be topographically blocked in reality. 140 If the sensitivity of flood inundation to decimetric-scale elevation changes 141 confirmed, it has two important impacts on the future of flood risk assess-142 ment and management. Firstly, it highlights the need for finely resolved and

ment and management. Firstly, it highlights the need for finely resolved and
 accurate topography, which poses significant challenges to current generation

computational resources. Secondly, it paves the way for a range of new opportunities for flood risk mitigation that have not been previously explored,
and which have the potential to considerably reduce the impacts of extreme
storms at relatively low cost.

The value of finely resolved topography in flood inundation modeling is 149 an issue of intense recent debate, particularly when analyzed in the broader 150 context of other sources of uncertainties that are inherently present in prac-151 tical flood risk assessments (e.g. *Dottori et al*, 2013 and references therein). 152 While results from grid refinement sensitivity analysis (e.g. Ozdemir et al. 153 2013) indicate that horizontal resolution plays an important role on model 154 results, it is unclear the extent to which small perturbations in the elevation 155 can produce significant changes to the patterns of surface flood inundation. 156 In this article an extremely fine resolution (10 cm) description of the urban 157 terrain is combined with a highly accurate and robust finite volume shallow 158 water model to analyze the effects of decimetric scale and localised changes 159 in the topography on the dynamics and outcomes of urban flooding. This 160 relation is explored by introducing small modifications in the elevation of 161 the original 10 cm resolution DEM, and comparing the simulation results 162 against those obtained with the undisturbed DEM. Even though direct mod-163 elling of floods at such fine resolution (i.e. 10 cm) is unfeasible for any 164 practical purposes in the foreseeable future, they offer a unique opportunity 165 to clarify the extent to which decimetric scale terrain features control flood 166 dynamics. The results of this analysis are then used to open a discussion 167 on the challenges and opportunities that are intrinsically associated with the 168 topography-impact nexus. 169

170 2. Numerical model

The model used here is based on the two-dimensional shallow water equations

$$\frac{\partial \mathbf{U}}{\partial t} + \frac{\partial \mathbf{F}(\mathbf{U})}{\partial x} + \frac{\partial \mathbf{G}(\mathbf{U})}{\partial y} = \mathbf{S}_1(x, y, \mathbf{U}) - \mathbf{S}_2(x, y, \mathbf{U})$$
(1)

where the $\mathbf{U}(x, y, t)$ is the vector of conserved variables, $\mathbf{F}(\mathbf{U})$ and $\mathbf{G}(\mathbf{U})$ are the flux vectors in the x and y directions, respectively, and $\mathbf{S}_1(x, y, \mathbf{U})$ and 175 $\mathbf{S}_2(x, y, \mathbf{U})$ are the slope and friction source terms, respectively:

$$\mathbf{U} = \begin{bmatrix} h\\ hu\\ hv \end{bmatrix}, \mathbf{F} = \begin{bmatrix} hu\\ hu^2 + \frac{1}{2}gh^2\\ huv \end{bmatrix}, \mathbf{G} = \begin{bmatrix} hv\\ huv\\ hv^2 + \frac{1}{2}gh^2 \end{bmatrix},$$
$$\mathbf{S}_1 = \begin{bmatrix} 0\\ ghS_{ox}\\ ghS_{oy} \end{bmatrix}, \mathbf{S}_2 = \begin{bmatrix} 0\\ ghS_{fx}\\ ghS_{fy} \end{bmatrix},$$

h is the water depth, u and v are the x and y components of the velocity, gis the acceleration due to gravity, S_{ox} and S_{oy} are the x and y components of the bed slope (i.e. $-\partial z/\partial x$ and $-\partial z/\partial y$, respectively, where z is the bed elevation) and S_{fx} and S_{fy} the corresponding components of the friction slope. The numerical model solves the integral form of eqs. (1):

$$\frac{\partial}{\partial t} \int_{\Omega} \mathbf{U} d\Omega + \oint_{\partial \Omega} (\mathbf{E} \cdot \mathbf{n}) dl = \int_{\Omega} (\mathbf{S}_1 - \mathbf{S}_2) d\Omega$$
(2)

where **E** is the 3×2 flux tensor $\mathbf{E} = (\mathbf{F}, \mathbf{G})$, Ω and $\partial \Omega$ respectively denote an arbitrary domain and its boundary, and **n** is a unit outward vector normal to $\partial \Omega$. Eqs. 2 can be obtained by integrating (1) over Ω and then applying Gauss's theorem to the integral of the flux terms.

The computational domain is discretised using an unstructured mesh composed of triangular cells (Figure 1). Eqs. 2 are integrated numerically using a first order Godunov finite volume scheme, and a fractional step (e.g. described in *LeVeque*, 2002). First the cell-averaged value of the conserved variables \mathbf{U}_i in cell Ω_i are updated considering the flux terms (homogeneous part) and the bed slope, but neglecting the friction source term. \mathbf{S}_1 is evaluated with the method of *Valiani and Begnudelli* (2006), by which the area integral of \mathbf{S}_1 in (2) is transformed into a boundary integral that can be computed numerically at the edges of the cells. This first step is written as:

$$\mathbf{U}_{i}^{*} = \mathbf{U}_{i}^{n} - \frac{\Delta t}{A_{i}} \left(\sum_{k=1}^{3} (\mathbf{E}^{*} - \mathbf{H})_{i,k}^{n} \mathbf{n}_{i,k} l_{k} \right) \quad ; \quad \mathbf{H} = \begin{bmatrix} 0 & 0 \\ \frac{1}{2}gh|_{\eta_{o}}^{2} & 0 \\ 0 & \frac{1}{2}gh|_{\eta_{o}}^{2} \end{bmatrix} \quad (3)$$

where \mathbf{U}_i^* is the intermediate value of \mathbf{U}_i (i.e. fractional step), A_i is the area of cell Ω_i , Δt is the time step, the superscript *n* represents the time level, subindex *k* is used to denote the *k*-th edge of a cell, l_k is the length of edge $k, \mathbf{E}^* = (\mathbf{F}^*, \mathbf{G}^*)$ represents the numerical approximation to \mathbf{E} , and $h|_{\eta_o}$ is the depth considering a piecewise constant free-surface elevation (*Valiani and Begnudelli*, 2006). The numerical fluxes \mathbf{F}^* and \mathbf{G}^* are computed using the central-upwind method of *Kurganov and Petrova* (2004). In the second step the friction term is accounted to update the solution to time level n+1 from the values of \mathbf{U}_i^* . Friction slope components S_{fx} and S_{fy} are computed using Manning's equation

$$S_{fx} = \frac{n^2 u \|\mathbf{u}\|}{h^{4/3}} \qquad \qquad S_{fy} = \frac{n^2 v \|\mathbf{u}\|}{h^{4/3}} \tag{4}$$

where *n* is the Manning's coefficient and $||\mathbf{u}||$ is the l^2 -norm of the velocity vector **u**. It is widely recognised that at very shallow depths, an explicit discretisation of the friction terms can cause an overshooting of friction that often leads to source term instability. In order to avoid this problem, time integration of the friction term is performed using an implicit scheme widely adopted by other shallow-water models (e.g. *Yoon and Kang*, 2004; *Sanders*, 2008; *Liang and Marche*, 2009; *de Almeida et al*, 2012):

$$(hu)_{i}^{n+1} = \frac{(hu)_{i}^{*}}{1 + \Delta tg \left[n^{2} \|\mathbf{u}\|/(h)^{4/3}\right]_{i}^{n}}$$
(5)

$$(hv)_{i}^{n+1} = \frac{(hv)_{i}^{*}}{1 + \Delta tg \left[n^{2} \|\mathbf{u}\|/(h)^{4/3}\right]_{i}^{n}}$$
(6)

Free-surface reconstruction and wetting and drying are handled by the volume/free-surface method (VFR) of *Begnudelli and Sanders* (2006), which provides a second-order accurate representation of the bed topography (*Begnudelli and Sanders*, 2006; *Begnudelli et al.*, 2008). This further enhances the accuracy in the description of the terrain given by the extremely fineresolution topography used in this paper. The stability of the model is controlled by the standard Courant-Friedrichs-Lewy (CFL) condition.

The model includes only the surface component of urban drainage. This 199 allows us to separate the influence of the urban terrain on the flood inun-200 dation from the rather complex interactions that can take place between 201 surface and the sewerage flows. While a realistic representation of real world 202 inundation requires the dynamic coupling of the two processes (Mark et al, 203 2004; Schmitt et al., 2004; Aronica and Lanza, 2005; Nasello and Tucciarelli, 204 2005; Maksimovic et al, 2009; Bazin et al, 2014), the study of the surface 205 component alone is appropriate for the objectives of the present analysis. 206

207 3. Test cases

A set of four different topographies have been used to analyse the influ-208 ence of small scale changes in urban topography on the dynamics and final 209 distribution of flooding. The tests use a 10 cm resolution digital elevation 210 model produced from terrestrial LiDAR data collected by the Environment 211 Agency of England and Wales (Ozdemir et al, 2013) in the urban area of Al-212 cester (Warwickshire, UK), which is shown in Figure 2.a. The computational 213 mesh generated using this DEM is composed of 3, 575, 123 nodes, 10, 711, 014 214 edges and 7, 135, 888 triangular elements. Figure 3 shows this computational 215 mesh close to a street junction, illustrating how fine scale elements such as 216 curbs are represented in the model. Such a fine resolution terrain model cap-217 tures the shape of road cambers extremely accurately (as shown by Ozdemir 218 et al, 2013), and the use of a second order model for the bed slope terms (in 219 which the terrain is represented as inclined, rather than horizontal triangles, 220 as described in *Beqnudelli and Sanders*, 2006 and *Beqnudelli et al.*, 2008) 221 brings the level of model representation of topography to a unprecedented 222 level. 223

Small scale modifications have been introduced to the original topography 224 in the two regions of the domain indicated with ellipses in Figure 2.a. These 225 modifications have been strategically defined from previous observations of 226 the simulations using the undisturbed topography. Namely, the combined 227 inspection of the road topography, topology and the characteristics of the 228 flood propagation indicated potential regions of the domain where the effect 229 of topographical manipulations could lead to significant changes in the evo-230 lution and final distribution of flooded areas. The extent and magnitude of 231 these alterations can be observed by comparing Figures 2.b and 2.d against 232 Figures 2.c and 2.e. respectively. In the first of these modifications, the ele-233 vation of the road in Figure 2.b is reduced over a distance of approximately 234 30 m and by a maximum value of 18 cm (Figure 2.c). The second alteration 235 was the introduction of a short hump (placed perpendicularly to the road di-236 rection and spanning from curb to curb) that increases the road elevation by 237 a maximum value of 12 cm (from Figure 2.d to 2.e). Finally, a third scenario 238 was generated by combining these two modifications into one DEM. Along 239 with the original DEM, this provides four different scenarios that can be com-240 pared to analyse the influence of decimetric scale changes of the topography 241 on inundation dynamics. These topographies will hereafter be referred to as 242 A (unmodified topography), B (alteration shown in Figure 2.c), C (alteration 243

shown in Figure 2.e) and D (the combination of terrain modifications shown
in Figures 2.c and 2.e). All scenarios use exactly the same mesh topology,
and only differ in the elevation of the road in the specific areas of the domain
described above.

Two flow boundary conditions were used in the simulations. The first 248 follows that previously adopted and described by *Ozdemir et al* (2013), which 249 was derived by assuming a 200-year return period 30-min rainfall that is 250 collected over a drainage area upstream of the inflow point. The discharge 251 increases linearly from 0 $m^3 s^{-1}$ to the peak value (0.35 $m^3 s^{-1}$) during the 252 first 7.5 min, is kept constant for the subsequent 15 min, after which it 253 falls linearly to $0 m^3 s^{-1}$ during the final 7.5 min (Figure 4). This boundary 254 condition is uniformly distributed across the road situated on the North-East 255 end of the computational domain in Figure 2.a. All other boundary edges 256 were set as solid walls, except at roads and pavements, where they were set 257 as open boundaries $(\partial \mathbf{U}/\partial \mathbf{n} = 0)$. The second set of boundary conditions 258 was obtained by multiplying the above hydrograph by 1.5 (peak discharge 259 of 0.525 $m^3 s^{-1}$) while maintaining all other boundaries unchanged. The two 260 different choices for the inflow boundary conditions will hereafter be referred 261 to as BC1 and BC2 respectively. In all simulations the value of Manning's 262 coefficient was set to n = 0.013 for roads and pavements, and n = 0.035263 elsewhere. Two groups (i.e. BC1 and BC2) of four simulations each (i.e. 264 using the four topographies previously described) were performed. 265

266 4. Results

Figure 5 shows the results of the group of simulations performed with 267 BC1 at t = 12, 30 and 60 min. Figures 5.a, 5.b, 5.c and 5.d, respectively 268 represent simulations with topographies A, B, C and D. In all simulations 269 the flood wave initially propagates southward along the main road located 270 on the East side of the domain. As the water reaches street junctions, part of 271 the flow can be diverted to side streets, depending on the local topography 272 of the junction and neighbouring streets. For example, in Figure 5.a, the 273 water passes by the first junction without being diverted. However, Figure 274 5.b shows that the reprofiling of the side street (-18 cm as presented in)275 Figure 2.c) allows the water to flow along North-West direction, inundating 276 a region of the domain that is dry during the simulation performed with the 277 original topography (Figure 5.a). A second flow diversion is also observed as 278 the water reaches the central part of the domain, resulting in inundation at 279

the topographical depression in the end of the street (center-west in Figures 280 5.a and b). This effect is considerably attenuated by the introduction of the 281 12 cm hump, as shown in Figure 5.c (e.g. at t = 30 and 60 min). The partial 282 blockage of this street diversion by the hump also leads to more water being 283 routed along the main road. This increased flow is now capable of overcoming 284 the topographical blockage in the next downstream junction, allowing part 285 of the flood wave to be diverted to the next street (as can be observed by 286 comparing Figure 5.a against 5.c at 30 and 60 min. The hump therefore 287 mitigates flooding in one region of the domain at the expense of flooding 288 areas that would otherwise be kept dry. A similar (although opposite) effect 289 occurs as a result of the diversion of part of the flood water towards the North-290 West part of the domain shown in Figure 5.b, which results in a decrease in 291 the volume of flow that is routed along the main road towards the South of 292 the domain. However, in this example the flow reduction does not produce 293 significant changes in the areas flooded downstream. The combined effects of 294 these two modifications of the topography on the flooded areas is evidenced in 295 Figure 5.d, which shows that only a negligible volume of the flood is diverted 296 towards the central part of the domain compared to the corresponding results 297 in Figure 5.a. In other words, two targeted minor alterations of the urban 298 topography were able to completely prevent the inundation of a part of the 299 domain that would otherwise receive a significant proportion of the flood 300 flow. The results of these simulations also show that the fine scale model 301 often captures the type of flow that occurs at low depths, when the water 302 flows exclusively close to the curbs (e.g. gutters), and does not inundate the 303 crown of the road camber. 304

Figure 6 shows the results of the simulations performed considering a 305 higher flow scenario (BC2 boundary condition) for the four topographies and 306 neglecting sinks. The propagation of the flood wave observed in this figure is 307 similar to that presented in Figure 5 although flow depths and flooded areas 308 are in general larger as a result of the increased flow rates. These results 309 confirm the high influence of the topography alterations on the dynamics of 310 flood inundation, as previously observed. Even though the combination of 311 the two modifications (Figure 6.d) are not capable of completely preventing 312 the inundation of the street located in the central region, it considerably 313 reduces its effect. For example, it can be observed from Figures 6.c and 6.d 314 that at t = 30 min the water overtopping the hump flows along the street 315 and accumulates in the lowest region; however, this effect is considerably 316 less pronounced in 6.d than in 6.a. The increase in the downstream hazards 317

induced by the 12 cm hump can also be observed by comparing Figures 5.c and 6.c.

320 5. Discussion

The results of the 8 simulations presented in section 4 show that model 321 predictions of surface water flood in urban areas are highly sensitive to 322 decimetric-scale features of the urban topography. In particular, the road to-323 pography close to junctions dictate whether diversions will occur, and there-324 fore plays a crucial role in the dynamics and final distribution of flooded 325 areas. It has been observed that a minor (i.e. 18 cm) and localized reduction 326 of the road elevation can lead to significant inundation of areas that would 327 otherwise not flood, while a small increase in the elevation (i.e. 12 cm) can 328 significantly reduce the impacts of flood inundation over large parts of the 329 urban domain. 330

The sensitivity of flood inundation to decimetric scale topography poses 331 significant challenges for accurate assessments of flood risk in urban areas. 332 First, it confirms the importance of high-resolution topographical datasets 333 on the quality of model predictions, as previously indicated by Ozdemir et 334 al (2013). This puts particular pressure on computational resources and 335 methods. Secondly, it also raises questions on the accuracy that is needed for 336 the vertical position of topography datasets. Currently, terrain elevation data 337 derived from airborne LiDAR that is usually used in flood risk assessment has 338 a vertical accuracy of approximately 5 to 15 cm. While our results show that 330 systematic elevation errors of this magnitude can have a significant impact on 340 predictions of flood risk, it is unclear how randomly distributed measurement 341 errors may affect the results. 342

The complexity of the inundation processes observed in the simulations, 343 combined with the sensitivity of the results to small changes, also reaffirms 344 standing questions on the limitations of simplified approaches adopted to 345 modeling urban flooding. For instance, at shallow depths water typically 346 flows exclusively along gutters, which operate as two separate and indepen-347 dent channels. With increasing depths, the flow eventually overtops the 348 crown of the road camber and the two separate channels merge into a single 349 cross section. This behavior cannot be captured by 1D models, nor can it be 350 reproduced by currently available sub-grid approaches. 351

While, on the one hand, the issues discussed above pose serious challenges for accurate modeling of floods in urban areas, they also unveil new

opportunities for flood risk management. Namely, it has been shown that 354 the final distribution of flood hazards can be significantly manipulated by 355 introducing very small and localized changes to the topography of the road 356 network. While it has been observed that alleviating harzards at particular 357 areas can lead to increased inundation downstream (or vice-versa), an over-358 all risk reduction can be obtained by selectively alleviating areas where the 359 damage caused by flooding is highest. For example, the urban surface can be 360 engineered to divert flood waters away from critical parts of the urban area 361 towards zones where the expected damage is limited or non-existent (e.g. 362 parks or green areas). The possibility of using the road network as efficient 363 open-channels to transport excess flood waters across the domain could pro-364 vide a new set of engineering techniques to expand current methods used in 365 urban drainage (which are largely limited to the function of delivering wa-366 ter to the sewer system). Such approach would fill an existing gap in flood 367 risk management, which lacks cost-effective measures to mitigate the impacts 368 of medium to extreme storm events. While high-frequency, low magnitude 369 events can usually be tackled by a combination of traditional (e.g. sewer 370 system design) methods and SuDS (e.g. soakaways, green roofs, pervious 371 surfaces, etc), these will often have only a minor effect on large flooding dis-372 asters, and expanding these systems to accommodate larger events is unlikely 373 to be cost-effective. Our results show that only minor changes in the urban 374 topography are needed to drive significant changes to the impacts, which 375 suggests that low cost risk mitigation could be achieved under this proposed 376 framework. 377

6. Summary and conclusions

This article analyzes the influence of small changes in the topography 379 of the urban terrain on the propagation and final distribution of flooding 380 in urban areas. Numerical simulations have been performed using a highly 381 accurate finite volume shallow water model and an extremely fine resolution 382 (i.e. 10 cm) topography of a real urban area in the United Kingdom. This 383 provided an unprecedented level of detail in the representation of the dy-384 namics of flood inundation over the urban terrain. Four different topography 385 scenarios were produced by introducing minor (decimetric scale) modifica-386 tions to the original urban topography. A total of 8 numerical simulations 387 were performed using two different inflow boundary conditions. 388

The results of these numerical experiments have shown that small alterations in the urban topography can lead to contrastingly different patterns of flood inundation. Namely, the combination of two targeted and minor modifications – whereby the elevation of the road has been locally lowered by 18 cm and raised by 12 cm – has almost completely prevented flooding from impacting a large proportion of the modelled domain.

The sensitivity of flood inundation to small changes in the urban topogra-395 phy gives rise to a number of challenges. First, capturing the effect of small 396 scale features requires finely resolved data that is rarely available for the 397 great majority of model simulations that are currently performed for prac-398 tical engineering studies. Second, not only the resolution of the datasets is 399 important, but the accuracy of the vertical position also becomes a issue of 400 high relevance. Airborne LiDAR datasets currently available have a vertical 401 accuracy of approximately 5 to 15 cm, which is of the same order of mag-402 nitude as typical depths that occur when overland flood flow is conveyed by 403 road networks. Finally, the computational cost of modelling flood inundation 404 at these scales is in general too high, or even unfeasible for most practical ap-405 plications. This is particularly true when multiple simulations are required, 406 which is typically the case in probabilistic risk assessments and engineering 407 assessment of multiple scenarios. 408

While the dependency of flood inundation on small scale topography dis-409 cussed above poses a number of practical difficulties to accurate assessments 410 of flood risk, it also paves the way to new possibilities of risk mitigation 411 that have not been explored to date. Namely, significant changes in the final 412 distribution of flood hazards could be achieved by manipulating the topog-413 raphy at key regions of the urban domain. This could be used to divert part 414 of the flood flow away from critical parts of the urban areas, or to guide the 415 flood wave towards low impact zones (e.g. parks). As our results illustrate, 416 only minor and localized modifications in the topography may be needed 417 to produce substantial change to flood hazards, indicating that considerable 418 mitigation can be achieved at low cost. The simulation results presented 419 in this article also suggest that alterations in the road topography nearby 420 road junctions can be particularly effective in producing major changes in 421 the dynamics of flood propagation. This is because in these areas the local 422 topography dictates how much water is diverted towards different parts of 423 the urban domain, and therefore plays a crucial role in the aftermath of the 424 urban flood. 425

The challenges and opportunities highlighted in this article are inher-

ently interrelated. The level of detail needed for the design and optimization of the surface drainage methods proposed above can only be achieved
in practice by enhanced availability of high-quality topographical data and
high-performance computational resources and techniques.

Finally real-world urban flood inundation can be influenced by a number of issues that are not taken into account in our numerical analysis, including complex interactions with the sewer system. While the results presented in this article provide evidence of the influence of small scale topography on the surface component of inundation, further research is needed to understand potentially important interactions between these mechanisms and the sewerage system.

438 7. Acknowledgements and data access information

The Environment Agency of England and Wales (EA) is acknowledged for providing the terrestrial LiDAR data used in this article. This data is copyrighted and can be requested under licence from the EA (www.environmentagency.gov.uk). All model results will be made available under request to the corresponding author.

444 8. References

- Aronica, G. T. and L. G. Lanza (2005), Drainage efficiency in urban areas: a
 case study, *Hydrological Processes*, 19 1105?1119, DOI: 10.1002/hyp.5648
- Bates, P. D., M. S. Horritt, and T. J. Fewtrell (2010), A simple inertial for- mulation of the shallow water equations for efficient two-dimensional flood inundation modelling, J. Hydrol, 387 33-45, doi:10.1016/j.jhydrol.2010.03.027.
- ⁴⁵¹ Bazin, P-H, Nakagawa, H., Kawaike, K., Paquier, A. and E. Mignot (2014),
 ⁴⁵² Modeling Flow Exchanges between a Strees and an Underground Drainage
 ⁴⁵³ Pipe during Urban Floods, *Journal of Hydraulic Engineering*, 140 No. 10,
 ⁴⁵⁴ 04014051
- Begnudelli, L. and B. Sanders (2006), Unstructured Grid Finite-Volume Algorithm for Shallow-Water Flow and Scalar Transport with Wetting and
 Drying, Journal of Hydraulic Engineering, 132 No. 4, 371–384

Begnudelli, L., Sanders, B. F., and S. F. Bradford (2008), Adaptive GodunovBased Model for Flood Simulation, *Journal of Hydraulic Engineering*, 134
No. 6, 714–725

Cunge J.A., Holly F.M. and A.Verwey (1980), Practical Aspects of Computational River Hydraulics. Pitman, London, U.K.

de Almeida, G. A. M., Bates, P. D., Freer, J., Souvignet, M. (2012), Improving the stability of a simple formulation of the shallow water equations for 2D flood modelling. *Water Resources Research*, VOL. 48,
doi:10.1029/2011WR011570

de Almeida, G. A. M. and P. D. Bates (2013), Applicability of the local
inertial approximation of the shallow water equations to flood modeling *Water Resources Research, VOL. 49*, 1?12, doi:10.1002/wrcr.20366

- DEFRA, 2008. Future Water: The Government?s Water Strategy for England. CM7319 London.
- ⁴⁷² Delleur, J. W. (2003), The Evolution of Urban Hydrology Journal of Hy-⁴⁷³ draulic Engineering, 129, 563–573
- ⁴⁷⁴ Djordjevic S. Prodanovic D. and Maksimovic (1999), An approach to simulation of dual drainage. *Water Science and Technology*, 39(9) 95-103
- ⁴⁷⁶ Dottori, F., Di Baldassarre, G. and E. Todini (2013), Detailed data is wel-⁴⁷⁷ come, but with a pinch of salt: Accuracy, precision, and uncertainty in ⁴⁷⁸ flood modeling. *Water Resources Research*, 49 6079-6085
- Environment Agency, 2009. Flooding in England: A National Assessment of
 Flood Risk, Environment Agency, Bristol, UK.
- Evans, E. P., Simm, J. D., thorne, C. R., Arnell, N. W., Ashley, R. M.,
 Hess, T. M., Lane, S. N., Morries, J., Nicholls, R. J., Penning-Rowsell,
 E. C., Reynard, N. S., Saul, A. J., Tapsell, S. M., Watkinson A. R. and
 H. S. Whether (2008), An update of the Foresight Future Flooding 2004
 qualitative risk analysis. *Cabinet Office*, London.
- Fang, Xing and D. Su (2005), An integrated one-dimensional and twodimensional urban stormwater flood simulation model *Journal of the American Water Resources Association*, 42(3), 713-724.

Gallegos, H. A., Schibert, J. E. and B. F. Sanders (2009), Two-dimensional,
high-resolution modeling of urban dam-break flooding: A case study of
Balwin Hills, California Advances in Water Resources, 32, 1323-1335.

Gallien, T. W., Schibert, J. E. and B. F. Sanders (2011), Predicting tidal
flooding of urbanised embayments: A modeling framework and data requirements. *Coastal Engineering*, 58, 567-577.

Guinot, V. (2012), Multiple porosity shallow water models for macroscopic
modelling of urban floods. Advances in Water Resources, 37, 40-72.

Kurganov, A. and G. Petrova (2004), Central-Upwind Schemes on Triangular
 Grids for Hyperbolic Systems of conservation Laws. Numerical Methods for
 Partial Differential Equations, 21, pp. 536-552

Leandro, J. Chen, A., Djordjevic, S. and D. A. Savic (2009), Comparison of
1D/1D and 1D/2D Coupled (Sewer/Surface) Hydraulic Models for Urban
Flood Simulation. Journal of Hydraulic Engineering, 135, No. 6 pp. 495504

LeVeque, R. J. (2002), Finite Volume Methods for Hyperbolic Problems, 257 pp., *Cambridge Univ. Press*, Cambridge, Mass.

Liang, Q. and F. Marche (2009), Numerical resolution of well-balanced shal low water equations with complex source terms Advances in Water Re sources, 32, 873-884

Maksimovic, C., Prodanovic, D., Boonya-Aroonnet, S., Leitao, J. P., Djord-jevic, S., and R. Allitt (2009), Overland flow and pathway analysis for
modelling of urban pluvial flooding *Journal of Hydraulic Research*, 47, 512-523

Mark, O., Weesakul, S., Apirumanekul, C., Boonya-Aroonnet, S. and S.
 Djordjevic (2004), Potential and limitations of 1D modelling of urban
 flooding *Journal of Hydrology*, 299, 284-299

Mignot, E., Paquier, A. and S. Haider (2006), Modeling floods in a dense
urban area using 2D shallow water equations. *Journal of Hydrology*, 327, 186-199

- Molinaro, P., Di Filippo, A., and F. Ferrari (1994), Modelling of flood wave
 propagation over flat dry areas of complex topography in presence of different infrastructures. In *Proceedings of Specialty Conference on "Modelling of flood propagation over initially dry areas"*, Milan, 20-30 June; 209-225
- Nasello, C. and T. Tucciarelli (2005), Dual Multilevel Urban Drainage Model
 Journal of Hydraulic Engineering, 131, No. 9, 748-754
- Ozdemir, H., Sampson, C. C., de Almeida, G. A. M., and P. D. Bates (2013),
 Evaluating scale and roughness effects in urban flood modelling using ter restrial LiDAR data *Hydrol. Earth Syst. Sci.*, 17, 4015-4030
- Sampson, C., Fewtrell, T. J., Duncan, A., Shaad, K., Horritt, M. S. and P.
 D. Bates (2012), Use of terrestrial laser scanning data to drive decimetric
 resolution urban inundation models, *Advances in Water Resources*, Vol.
 41, 1–17
- Sanders, B. (2008), Integration of a shallow water model with a local
 time step, Journal of Hydraulic Research, Vol. 46, No. 4, 466–475,
 doi:10.3826/jhr.2008.3243
- Sanders, B., Schubert, J. E. and H. A. Gallegos (2008), Integral formula tion of shallow-water equations with anisotropic porosity for urban flood
 modeling, *Journal of Hydrology*, 362, 19–38
- Soares-Frazao, S, Lhomme, J., Guinot, V., and Y. Zech (2008), Two dimensional shallow-water model with porosity for urban flood modelling,
 Journal of Hydraulic Research, Vol. 46, No. 1, 45-64
- Schmitt, T. G., Thomas, M. and N. Ettrich (2004), Analysis and modelling
 of flooding in urban drainage systems, *Journal of Hydrology*, 299, 300–311
- Valiani, A. and L. Begnudelli (2006), Divergence form for bed slope source
 term in shallow water equations, *Journal of Hydraulic Engineering*, 132
 No. 7, pp. 652-665
- Yoon, T. H. and S-K. Kang. (2004), Finite Volume for Two-Dimensional
 Shallow Water Flows on Unstructured Grids, Journal of Hydraulic Engi *neering*, 130 No. 7, 678-688

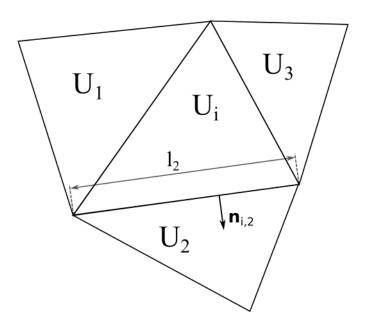


Figure 1: Ustructured computational mesh variables.

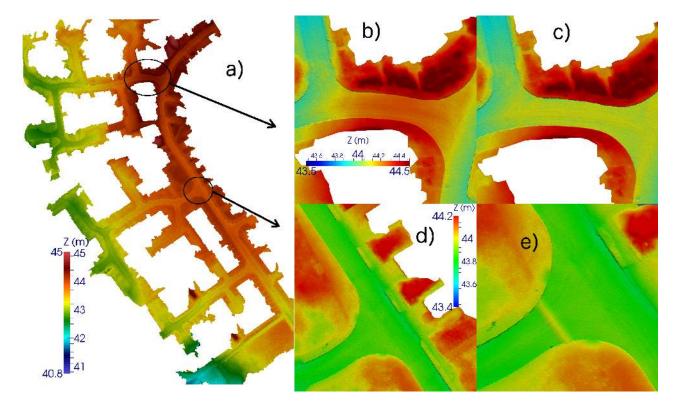


Figure 2: Original and modified DEMs. a) original DEM; b and d) zoom of the two regions indicated in the original DEM; c and e) modified DEMs.

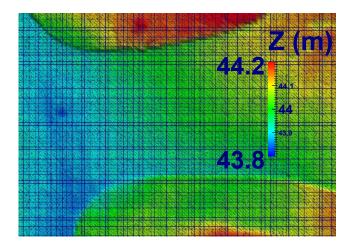


Figure 3: Detail of the computational mesh used.

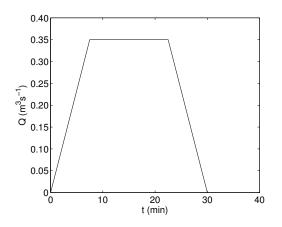


Figure 4: Hydrograph used as the upstream boundary condition in BC1.

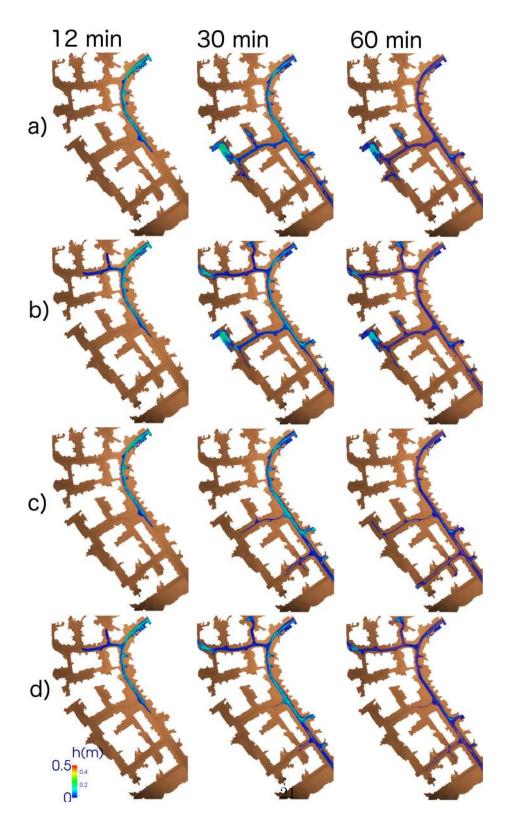


Figure 5: Results of the simulations using BC1 boundary conditions and neglecting the sewerage system. Results are shown at t = 12, 30 and 60 min and for the four scenarios. a) original topography; b) DEM modification corresponding Figure 1.c; c) DEM modification shown in Figure 1.e; d) combination of the two modifications.

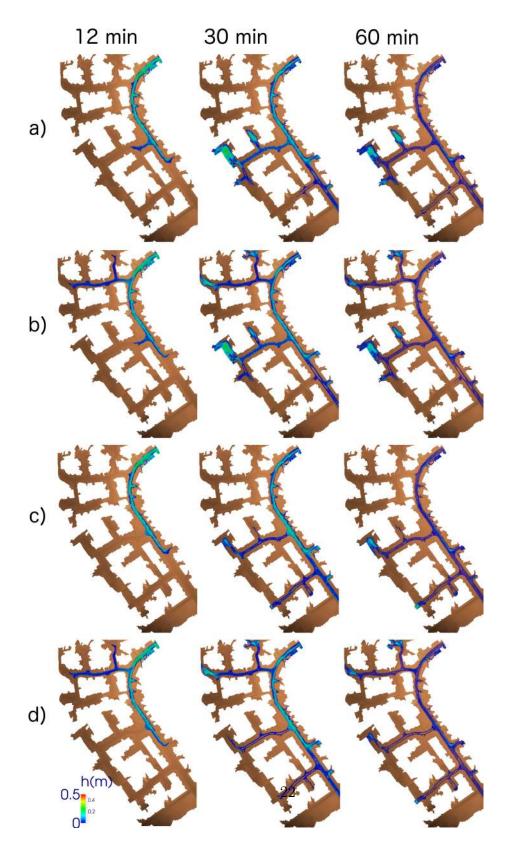


Figure 6: Results of the simulations using BC2 boundary conditions and neglecting the sewerage system. Results are shown at t = 12, 30 and 60 min and for the four scenarios. a) original topography; b) DEM modification corresponding Figure 1.c; c) DEM modification shown in Figure 1.e; d) combination of the two modifications.