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Pierre-Antoine Versini, D Ramier, E Berthier, B de Gouvello. Assessment of the hydrological impacts of green roof: From building scale to basin scale. Journal of Hydrology, 2015, 524, pp.562-575. 10.1016/j.jhydrol.2015.03.020. hal-01151761

# HAL Id: hal-01151761 https://hal.science/hal-01151761v1

Submitted on 13 May 2015

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## 17 Abstract:

At the building scale, the use of green roof has shown a positive impact on urban runoff 18 19 (decrease and slow-down in peak discharge, decrease in runoff volume). The present work aims to study whether similar effects are possible at the basin scale and what is the 20 minimum spreading of green runoff needed to observe significant impacts. It is 21 particularly focused on the circumstances of such impacts and how they can contribute 22 to storm water management in urban environment. Based on observations on 23 experimental green roofs, a conceptual model has been developed and integrated into 24 25 the SWMM urban rainfall-runoff model to reproduce the hydrological behaviour of two different types of green roof. It has been combined with a method defining green 26 roofing scenarios by estimating the maximum roof area that can be covered. 27

This methodology has been applied on a long time series (18 years) to the Châtillon urban basin (Haut-de-Seine county, France) frequently affected by urban flooding. For comparison, the same methodology has been applied at the building scale and a complementary analysis has been conducted to study which hydrometeorological variables may affect the magnitude of these hydrological impacts at both scales.

33 The results show green roofs, when they are widely implemented, can affect urban runoff in terms of peak discharge and volume, and avoid flooding in several cases. Both 34 precipitation – generally accumulated during the whole event- and the initial substrate 35 36 saturation are likely to have an impact on green roof effects. In this context, the studied green roofs seem useful to mitigate the effects of usual rainfall events but turn out being 37 less helpful for the more severe ones. We conclude that, combined with other 38 infrastructures, green roofs represent an interesting contribution to urban water 39 management in the future. 40

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42 **Keywords:** Green roof, hydrological modelling, SWMM, flooding, sewage network

#### 43 **1-Introduction**

Historically used for isolation purposes in Nordic countries, green roofs have become relatively commonplace over the last 20 years in countries subject to more continental climate as Germany, Austria and Switzerland. In the last years, the spread of green roofs has steadily increased in developed countries. The annual green roof covering is estimated between 0.1 and 1 km<sup>2</sup> in several countries all over the word (Spain, Brazil, Canada, Korea, UK or Japan), while it is estimated to reach 2 km<sup>2</sup> in France and even more than 10 km<sup>2</sup> in Germany (Lassalle, 2012).

Such a success is part of the general policy of urban areas revegetation and can be 51 explained by two main reasons. First, roof areas represent a significant part of the 52 surfaces of city centres where no space is available for new infrastructures (about 40-53 50% of the impervious areas, cf. Dunnett and Kingsbury, 2004). Secondly, from an 54 architectural point of view, green roofs may contribute to enhance the aesthetic value of 55 buildings, but also to reduce heat island through increasing evapotranspiration 56 (Takebayashi and Moriyama, 2007; Santamouris, 2012), to improve the quality of the 57 air (Banting et al., 2005), to protect biodiversity (English Nature, 2003) and to manage 58 59 urban runoff.

This last point - urban runoff management – is a significant argument to promote the development of green roof. Indeed, in order to cope with urbanization and its related problem of space, green roofs –as well as porous pavements, harvesting tanks, soakaways or ponds- are part of the so called stormwater Source Control (SC) which has gained relevance over traditional sewer approaches (Urbonas and Jones, 2002; Delleur, 2003; Petrucci *et al.*, 2012). The principle of SC is to develop, simultaneously to urban growth, facilities to manage stormwater at a small-scale (about  $10^2-10^3$  m<sup>2</sup>) to

solve or prevent intermediate scale  $(10^4 - 10^6 \text{ m}^2)$  stormwater issues. At the building 67 scale, green roofs have the possibility to control both the quantity and the quality of 68 urban runoff. Qualitatively, it can avoid the direct contribution of metals to receiving 69 water as traditional roofs (Egodawatta et al., 2009; Gromaire et al., 2011). Nevertheless, 70 an increase in phosphorous concentration due to vegetation coverage can be noticed 71 (Gromaire et al., 2013). From a quantitative point of view, the main performance of 72 green roofs in stormwater management is the reduction of runoff volume at the annual 73 scale and the peak attenuation and delay at the rainfall event, depending essentially on 74 the green roof configuration, the rainfall intensity and the antecedent soil moisture 75 conditions. 76

These quantitative impacts have already been studied by several works based on observation or modelling. Typically, quite small surfaces of experimental green roofs were instrumented to set continuous runoff and precipitation data on short periods of time (not exceeding 3 years). These data are then analysed to study and explain the fluctuation of green roofs responses in terms of peak discharge and runoff volumes.

A very small test bed of 3 m<sup>2</sup> comprising sedum extensive vegetation growing in 80 mm of substrate was conducted by Stovin *et al.* (2012) in Sheffield (UK). The rainfall-runoff monitoring was performed continuously over a period of 29 months. The annual cumulative retention was 50% and the peak attenuation ranged from 20 to 100% (median of 59%). In this case, it was not possible to establish any relationship between rainfall retention percentage and the storm characteristics or the antecedent weather variables.

<sup>89</sup> Voyde *et al.* (2010) instrumented six hydraulically isolated plots of about 10-50 m<sup>2</sup> on <sup>90</sup> the Aukland University (New Zealand) during one year. These plots differed according

to their substrate types (expanded clay, zeolite and pumice) and depths (50 or 70 mm). 91 92 Except for one specific plot where coconut coir fibre was implemented in the sedum mat, there was no statistically significant difference in the hydrologic response from the 93 three different substrate types. During the year-long experiment, 66% of precipitation 94 was retained and a peak flow reduction ranging from 31% to 100% (median of 93%) 95 was observed. Moreover, no statistically significant season-related variations were also 96 97 recorded for either rainfall or runoff response. On the same site, additional data (2 years) were analysed by Fassman-Beck et al. (2013) and similar results in terms of 98 water balance were obtained. Nevertheless, statistically significant seasonal variation 99 100 was observed, demonstrating the importance of long-term monitoring.

101 A larger surface was covered by green roof in Genoa (Italy) where about  $350 \text{ m}^2$  were 102 divided in two plots, each one comprising a substrate of 200 mm and drainage layer 103 (Palla *et al.*, 2011) differentiated according to their substrate mix. At the event scale, the 104 study, carried out over 6 months, showed a retained volume varying between 10 and 105 100% (average of 85%), and a peak flow reduction ranging from 80 to 100% (average 106 of 97%).

Additional studies can be mentioned: Monterusso et al., 2004 ; Bengtsson et al., 2005 ; 107 Dunnett et al., 2008 ; Gregoire and Clausen, 2011 among others. They all conclude, and 108 109 sometimes contradictorily, that green roof response appears not to be link to one only factor. These numerous contributions show several parameters may have an impact on 110 hydrological response such as rainfall accumulation and intensity (Carter and 111 Rasmussen, 2006; Simmons et al., 2008), the climatic conditions, seasonality (Mentens 112 113 et al., 2006; Villarreal, 2007), the antecedent conditions (Bengtsson et al., 2005; 114 Denardo et al., 2005), and to a lesser extent, the substrate species and the depth or roof slope (Villarreal and Bengtsson, 2005; Getter et al., 2007). A detailed review on the 115

influence of these parameters is available in Berndtsson (2010). It has also to be noticed
that recent studies conducted over a longer time period (Carso*n et al.*, 2013; FassmanBec*k et al.*, 2013) show that rainfall depth appears to be the dominant factor in retention
performance.

120 On the other side, few works attempted to simulate the hydrological response of green roof by using adapted models. They were usually devoted to reproduce observed runoff 121 at the experimented roof scale or to extrapolate the green roof impact at the urban 122 catchment scale. Hilten et al. (2008) tested HYDRUS-1D (Šimůnek et al., 2008) which 123 is a soil moisture transport simulation using Richards' equation for variably-saturated 124 water and convection-dispersion type equations. They tried to simulate the hydrological 125 response of a 37 m<sup>2</sup> green roof. Although HYDRUS-1D was able to correctly reproduce 126 runoff for small rain events, it failed for the largest ones by overestimating the peak 127 discharge. 128

The SWMS\_2D model (Šimůnek *et al.*, 1994), based on Richards' law and the Van Genuchten–Mualem functions, was also applied to simulate the variably saturated flow of an experimental green roof system (Palla *et al.*, 2009). Applied on 8 rainfall events, the model adequately reproduced the hydrographs, as demonstrated by the limited relative percentage deviations obtained for the total discharged volume, the peak flow, the hydrograph centroid and the water content along the vertical profile.

Simplified procedures were used to model green roof at a greater scale than the building
one. Palla (2008a) used the Soil Conservative Service (SCS) Curve Number (CN,
Mockus, 1957) as infiltration model in an aquifer system to simulate green roof
response at the catchment scale in the Storm Water Management Model (SWMM,
Rossman, 2004). It was calibrated using results from a small size system realized in

140 laboratory then applied on a 18 years simulation period. It was also the case in Carter 141 and Jackson (2007) where the SCS infiltration method was used to simulate green roof 142 response with a CN value equal to 86. Using synthetic precipitation events they 143 evaluated the impact of a widespread green roof application in an urban watershed.

Additionally, some efforts were made to build a simple and robust model of green roof hydrological behaviour, in order to be used as a support tool devoted to extensive green roof design (Berthier *et al.*, 2011). Based on a reservoir cascade, this model appeared suitable to reproduce the hydrological behaviour of a 146 m<sup>2</sup> green roof located in Paris region (France) during one year.

Although the literature on green roof hydrological impacts has greatly developed in the 149 last years, still few works have concentrated on to study long time period and on their 150 use to solve urban management issues. Using a modelling system developed from an 151 experimental setup, the work presented herein aims to study the green roof impacts on 152 urban runoff over 18 years comprising a large and heterogeneous set of 153 hydrometeorological situations. By comparing the results obtained at the building scale 154 and at the basin scale, this paper is particularly focused on: (1) how far the 155 156 dissemination of green roofs at large scale may affect urban runoff as much as for the 157 building scale, (2) what are the main factors conducting the hydrological response at 158 both scales and to what extent are they predictable.

The paper is structured as follows: Section 2 presents the specific model developed to estimate green roof hydrological response. Section 3 describes the studied basin, the geographical and meteorological data used. Section 4 presents the modelling framework and the methodology used in this study. Assessment of hydrological impacts of a green roof at the roof scale and at the basin scale is presented in Section 5. From a more

operational point of view, Section 6 analyses the conditions of these hydrological impacts on stormwater management and how they can be predicted by taking into account several hydrometeotrological variables. Finally, Section 7 discusses the hypothesis made in the study and Section 8 summarizes the main results and concludes on future improvements and possible applications of green roofs for operational issues.

169

#### 170 **2- Green roof modelling**

171 2-1 Experimental setup

An experimental green roof was built on the site of the CEREMA in Trappes (45 km 172 173 South-West from Paris, France). The area of an already existing roof was split into 6 different plots of  $35 \text{ m}^2$  (7X5 m). These plots were covered by a specific green roof 174 infrastructure presenting different configuration in terms of vegetation (sedum or grass), 175 176 substrate depth (3 or 15 cm) and drainage layer (expanded polystyrene or lava stone). Rainfall and discharge were continuously monitored at each plot from June 2011 to 177 August 2012. Rainfall was measured with a tipping bucket raingauge located on the 178 roof, with a resolution of 0.1 mm. Discharge from each plot was measured continuously 179 at the outlet of the downspouts with custom-made PVC tipping bucket, having a 180 resolution of 0.01 mm (i.e. a volume of 350 ml per tip over the 35m<sup>2</sup> plot). Time series 181 were aggregated to 3 minutes intervals. 182

In this study, observations from two specific configurations of green roof were used. They combine an extensive vegetation layer made with a mix of Sedum species (S. Album, S. Sexagulare, S. Reflexum, S. Kamchatikum, S. Spurium, S. Acre), a substrate with lapillus, peat and green compost (organic part represents 3.4% in mass of the substrate), a filter layer (geotextile) and a drainage layer with expanded polystyrene of 4 cm depth. The two green roof configurations differ in terms of the depth of the
substrate. For the first one, called SE3Y, the thickness is 3 cm and for the second one,
called SE15Y, the thickness is 15 cm.

During the study time period, around 100 rain events (for a total rainfall of 827 mm) 191 192 were observed for which rainfall accumulation was higher than 1 mm. They were all quite "soft" events and characterized by low return periods (the highest is about 1 year). 193 These events produced runoff in most cases for green roof SE3Y plot (59% of the 194 195 events) and less often for SE15Y one (45% respectively). It appeared the volumetric runoff coefficient for both green roof configurations varied significantly from an event 196 to another, ranging from 0 to 1 with an average value of 0.17 for SE3Y and from 0 to 197 0.82 with an average value of 0.11 for SE15Y respectively. As mentioned in a previous 198 study (Voyde et al., 2010), retention efficiency seems to decrease as storm depth 199 increases and as antecedent conditions reveal a high level of moisture in the substrate. 200 For the most significant events, volumetric runoff coefficients are quite equal between 201 both configurations and can occasionally be higher for SE15Y configuration if the 202 203 substrate already contained water resulting from a previous event. Due to the short number of events, for now no definitive conclusion can be stated. 204

Note that more details on the experimental site is available in Gromaire *et al.* (2013). In this study, this data are only used to develop and calibrate the hydrological model.

207

#### 208 2-2 Presentation of the hydrological model

Storm Water Management Model (SWMM version 5.0, see Rossman, 2004) has been used in this study. It is a dynamic rainfall-runoff model especially developed by the United States Environmental Protection Agency (EPA) for urban/suburban areas. The

sewer network including junction nodes, conduits, and specific infrastructures (weir, 212 213 orifice, storage unit ...), is designed to simulate and estimate the hydrological behaviour of a typical basin. As SWMM is a semi-distributed model, each basin is divided in 214 several sub-basins on which the water balance is computed. The SWMM module called 215 "Bio-retention Cell" has been used and significantly modified to simulate the 216 hydrological response of the instrumented green roofs as this original module was not 217 218 able to do it accurately. Modifications are inspired by the model developed by Berthier et al. (2011) representing each layer of green roof infrastructure (vegetation, substrate 219 and drainage) by 3 different reservoirs (Figure 1). The main modifications concern the 220 221 vegetation reservoir (that produces discharge only when the field capacity is reached), the soil reservoir (by using the saturated hydraulic conductivity to produce discharge 222 and by splitting its output into two components), and a transfer function that has been 223 224 added to every reservoir output. This model is presented in detail in the following sections (note that simulated discharges, precipitation, simulated evapotranspiration and 225 simulated reservoir levels are all expressed as water levels (mm) over the 35 m<sup>2</sup> plot). 226

227

A first reservoir models the vegetation layer which is supposed to retain a small amount of rainfall. If the storage capacity of the vegetation layer is lower than the precipitation, the complementary part of the precipitation ( $Q \ veg(t)$ ) infiltrates into the substrate:

231 
$$Q_veg(t) = \max[P(t) - (H_veg - N_veg(t)), 0]$$
 (Eq. 1)

Where  $H\_veg$  is the vegetation reservoir depth (i.e. the maximum water depth stored by the vegetation layer),  $N\_veg(t)$  is the vegetation reservoir level a time t, and P(t) is the precipitation rate. The second reservoir represents the substrate layer which can produce surface runoff when it is saturated ( $Q_sat(t)$ ) when it is no longer able to infiltrate water (it has to be noticed that this rare situation was not observed on Trappes experimental sites, even for the thinnest substrate):

239 
$$Q\_sat(t) = \max[Q\_veg(t) - (f\_sub - \theta(t)) \times H\_sub,0]$$
(Eq. 2)

Where *f\_sub* is the substrate porosity, representing the soil fraction where water can be stored,  $\theta(t)$  is the volumetric water content at time *t*, and *H\_sub* the substrate depth. *N* sub(t)=H sub ×  $\theta(t)$  represents the substrate reservoir water level at time t.

The substrate reservoir produces an output discharge  $(Q\_sub(t))$  when the water content in the substrate is greater than the field capacity:

245 
$$Q_{sub}(t) = \max\left[\frac{Ksat}{\Delta t \times H_{sub}} \times (\theta(t) \times H_{sub} - FC), 0\right]$$
(Eq. 3)

Where *Ksat* is saturated hydraulic conductivity (in mm/s),  $\Delta t$  is the time step (in s) and *FC* is the field capacity (in mm).

A small fraction  $Q_frac(t)$  of the output discharge is transferred to a routing reservoir representing the water temporary stored in the drainage layer:

250 
$$Q_{frac}(t) = Q_{sub}(t) \times \left[1 - \left(1 - f_{dra}\right) \times \left(\frac{N_{dra}(t)}{H_{dra}}\right)^4\right]$$
(Eq. 4)

Where  $f\_dra$  is the void fraction of the drainage layer,  $N\_dra(t)$  is the routing reservoir water level, and  $H\_dra$  is the routing reservoir depth.

At the output of the substrate, a runoff  $Q_dra1(t)$  is directly available while the routing reservoir produces a runoff  $Q_dra2(t)$ :

255 
$$Q_dra1(t) = Qsub(t) - Qfrac(t)$$
(Eq. 5)

256 
$$Q_{dra2}(t) = N_{dra}(t) + Qfrac(t) - H_{dra}$$
 (Eq. 6)

Every contribution to the total discharge  $(Q\_sat(t), Q\_dra1(t))$  and  $Q\_dra2(t))$  are first routed to the outlet using a transfer function based on Manning-Strickler equation before being summed to  $Q\_tot(t)$ :

260 
$$Q_{rout}(t) = \alpha \times Q * (t)^{\frac{5}{3}} \times \frac{L}{S}$$
 (Eq. 7)

261 
$$\alpha = \frac{1.49}{R} \times \sqrt{p}$$
(Eq. 8)

Where  $Q\_rout(t)$  is the routed discharge assessed from  $Q^*(t)$  ( $Q^*(t)$  represents indiscriminately  $Q\_sat(t)$ ,  $Q\_dra1(t)$  and  $Q\_dra2(t)$ ), *S* and *L* are the width and the area of the considered surface, *R* is the Manning roughness coefficient and *p* is the slope.

Evapotranspiration (ET) is estimated for each layer by 265 using potential evapotranspiration computed by the French Weather service (PET daily measures in 266 Villacoublay which is located 10 km from Trappes). The PET value is representative of 267 the evapotranspiration for a short and always irrigated grass. To be more realistic, this 268 data has been corrected by using seasonnal water balances computed with experimental 269 data. PET data has also been adjusted by using a coefficient: 0.7 in winter and 0.9 in 270 summer for SE3Y, 0.5 and 0.7 for SE15Y respectively. During dry periods (it is 271 assumed that no evapotranspiration occurs during rain periods), water is 272 evapotranspired from the top to the bottom, starting with the vegetation reservoir: 273

274 
$$Eta\_veg(t) = Min(ET(t), N\_veg(t))$$
(Eq. 9)

275 
$$Eta\_sub(t) = Min(Max(ET(t) - Eta\_veg(t), 0.), (H\_sub - WP) \times f\_sub) (Eq. 10)$$

276 
$$Eta\_dra(t) = Min(Max(ET(t) - Eta\_sub(t), 0.), N\_dra(t) \times f\_dra)$$
(Eq. 11)

Where ET(t) is the estimated adjusted evapotranspiration, *WP* the wilting point,  $Eta\_veg(t)$ ,  $Eta\_sub(t)$  and  $Eta\_dra(t)$  the respective simulated evapotranspiration for vegetation, substrate and drainage layers.

At the end of each time step, reservoirs are updated by taking into account the different inputs and outputs. A Modified Puls method is used for this purpose as proposed in the initial version of SWMM.

The majority of the parameters characterizing the three green roof layers are determined by their intrinsic properties (geometry of the structure, thickness of the substrate and the layer of drainage, slope...). Finally, only four parameters have to be calibrated, essentially according the to substrate properties: porosity ( $f_sub$ ), field capacity (FC), saturated hydraulic conductivity (Ksat) and roughness (R).

288

#### 289 2-3 calibration and validation procedures

Observed precipitation and discharge data compiled from June 2011 to August 2012 in Trappes have been used to adjust the model parameters for SE3Y and SE15Y configurations. This observation period was divided into two sub-periods: from June 2011 to January 2012 for calibration and from February 2012 to August 2012 for validation. Both sub-periods contain a dry and a wet sequence. Wet sequences occurred in December 2011 (136 mm of the 472 mm have fallen during the calibration period) and in June 2012 (132 mm of the 345 mm have fallen during the validation period). The model was calibrated by using a Rosenbrock procedure. Nash efficiency (Nash and Sutcliffe, 1970) was selected and used as the optimization criterion to evaluate the performance of the model (difference between observed and simulated discharges). It was computed for non-zero values to focus the calibration on wet sequences:

301 
$$Nash = 1 - \frac{\sum_{i=0}^{n-1} (Qobs(t_0 + i \times \Delta t) - Qsim(t_0 + i \times \Delta t))^2}{\sum_{i=0}^{n-1} (Qobs(t_0 + i \times \Delta t) - \overline{Qobs})^2}$$
(Eq. 12)

Where  $t_0$  is the initial time step,  $Qobs(t_0+i\times\Delta t)$  and  $Qsim(t_0+i\times\Delta t)$  are the observed and the simulated discharge at time step  $t_0+i\times\Delta t$ ,  $\overline{Qobs}$  the average observed value and *n* the total number of time steps. Note that Nash criterion can be computed over a long time period or over a single event.

An additional indicator, the difference between observed and simulated total runoff
 volumes (absolute volume error), has also been computed:

308 
$$V\_error = \frac{(Vobs - Vsim)}{Vobs} \times 100$$
 (Eq. 13)

309 Where *Vobs* and *Vsim* are the observed and simulated total runoff volumes.

Satisfactory results were obtained for both green roof configurations for both calibration/validation continuous time periods. Almost every observed peak discharge was simulated and the highest peaks were particularly well represented. Nash efficiencies computed over the calibration period were higher than 0.7 (0.72 for SE3Y and 0.82 for SE15Y). This difference can be explained by the modest reproduction of SE3Y small peaks that are not generated by the SE15Y configuration. Moreover, volume errors showed that the water balance was correctly respected with some values lower than 10% (9% for SE3Y and 5% for SE15Y). These figures were slightly lower on the validation period (Nash equal to 0.64 for SE3Y and 0.80 for SE15Y and volume error equal to 5% for SE3Y and 9% for SE15Y). This seemed to be related to an overestimation of evapotranspiration. In this case, runoff volume was underestimated and some small peaks were not reproduced by the model. As the estimated daily evapotranspiration values were not realistic, it is a weakness of the model which influenced the draining of the reservoir during periods without rain.

324 An additional validation procedure was also carried out at the rainfall event scale. The average individual Nash efficiency and volumetric criteria were computed for every 325 event for which the observed precipitation exceeded 8 mm (14 events). Average 326 individual Nash value was 0.56 for SE3Y (volume error equal to 17%) and 0.55 for 327 SE15Y respectively (volume error equal to 11%). It has to be noticed that the best 328 results were usually obtained for the most important events of the time period. The 329 comparison between observed and simulated discharges for the four main events is 330 plotted in Figure 2 (Note that the first event belongs to the calibration period, whereas 331 332 the other ones belong to the validation period). It appears that dynamics of runoff were well reproduced by the model. For these events, individual Nash efficiency was higher 333 than 0.8 for SE15Y configuration and quite lower for the SE3Y one because of a delay 334 335 of few minutes in the simulated response. For both configurations, the peak intensity was particularly well simulated with an absolute error lower than 10% in most of the 336 337 cases.

Calibrated parameters are reported in Table 1. As the model structure is based on a simplification of the physical phenomena, the calibrated parameters were not always close to the range of values that might be expected from physical principles alone. Sometimes quite different values were calibrated for the same type of green roof."

Although they should be equal for both types of green roof configurations, Roughness 342 (R=0.51 for SE3Y and R=0.65 for SE15Y) and saturated hydraulic conductivity 343 (Ksat=104.7 mm/h for SE3Y and Ksat=2.0 mm/h) are different. While the SE3Y 344 conductivity value is physically reasonable, the SE15Y one is very low, indicating the 345 model's difficulty in representing the measured hydrological behavior with a simplified 346 structure. This low value seems to be compensated by a lower Field Capacity (0.39 for 347 SE3Y and 0.21 for SE15Y) or/and estimated evapotranspiration. As porosity (f sub) is 348 only used in the Q sat computation, it has not been possible to calibrate it on the study 349 time period (no surface runoff was observed or/and simulated). The theoretical value of 350 351 0.4 has also been used.

352 The aim of this simple model was to obtain an accurate and robust representation of green roofs' behaviour rather than an accurate representation of physics and parameters. 353 Finally, despite small inconsistencies not affecting the representation of the main peak 354 discharges, the results illustrate the ability of this new SWMM module to simulate 355 green roof behaviour for both green roof configurations; particularly for the most 356 357 important runoff that is the main point of interest in this study. Therefore, this model is used for this work to simulate the hydrological response of every building that could be 358 covered by green roof at the basin scale. We also assume buildings' roofs are subject to 359 360 the same conditions than Trappes ones in terms of geometric constraints (slope) and climate (French oceanic degraded climate). 361

362

#### 363 **3-Case study: the Hauts-de-Seine county**

364 3-1 Case study framework

365 The Hauts-de-Seine county is located west of Paris (France). It is a highly populated

and urbanized area (1.5 million inhabitants for a surface of 176 km<sup>2</sup>). The northern part 366 is very urbanised and limited by the Seine River, whereas the southern part is less 367 populated with the presence of several forests. The climate of the Hauts-de-Seine is very 368 close to the rest of Paris Basin (including Trappes) with mild winters, frequent rainfall 369 in autumn, mild spring and high summer temperatures with possible occurrence of 370 intense rainfall. The average annual rainfall over the county is about 700 mm, and rather 371 constant over the different months, whereas the decennial hourly rainfall is about 372 35 mm. 373

Because of the rapid urbanization growth during the 90's and the difficulty to build new 374 management infrastructures due to high density, stormwater network is very sensitive to 375 intense precipitation which may cause local floodings. Since the beginning of 2000's, 376 the local authority in charge of water management (Water Direction of the Haut-de-377 Seine county) has promoted mitigation solutions as Sustainable Urban Drainage System 378 (SUDS). In this context, the Hauts-de-Seine county has set up a grant policy to promote 379 regulated flat roofs and is also concerned with studying the impacts of existing and 380 future green roofs on urban runoff in order to refine their approach in urban hydrology. 381 382 Moreover, the implementation of green roofs is particularly interesting in this county because of the high development rate expected in this area over the next years. 383

Châtillon basin, chosen as case study, is located southeast of the Hauts-de-Seine county. It is a moderate urban basin of 2.37 km<sup>2</sup> characterized by a quite steep topography with an average slope of 3.5%. The dowstream part of the basin is essentially covered by individual housing, whereas the upstream part is rather covered by collective housing and economical activities (See Figure 3-a). Due to this intense urbanization, the basin is also characterized by an average impervious coefficient of 55%. Châtillon basin is equipped with combined sewer network supplied by waste water produced by 29,500

equivalent inhabitants. Local floodings often occur along the Boulevard de Vanves (see 391 392 Figure 3), a main road crossing the city center. The pipe along the Boulevard until the outlet is not large or/and steep enough to route the runoff during intense rainfall. Note 393 that there is a weir downstream of the Boulevard de Vanves and the basin outlet 394 receives water that passes over this weir. Only the water exceeding the weir level is 395 routed to the basin outlet. According to Water Direction of Hauts-de-Seine county, 396 flooding occurs when the discharge exceeds the limit value of  $4.7 \text{ m}^3/\text{s}$  at the outlet 397 (called "flooding threshold" in the following). 398

399

#### 400 3-2 Hydrometeorological data

Regarding the meteorological information, the Hauts-de-Seine county is well covered by a rather dense raingauge network. A continuous precipitation database from a rain gauge located close to the Châtillon basin has been provided by the Water Direction of the county. It covers a full time period from 1993 to 2011 with a time resolution of 5 minutes. Note that, on this time period, the mean annual rainfall was 651 mm (snow is not considered) for a minimum of 435 mm in 2003 and a maximum of 935 mm in 2001.

54 storm events were extracted from this database. They correspond to those for which 407 the simulated discharge exceeds the flooding threshold. These events differ from their 408 maximal intensity (from 6.8 to 63.2 mm/h), duration (from 10 minutes to 8.5 hours) and 409 total rainfall accumulation (from 7.4 to 112.8 mm). They are represented on the 410 Intensity-Duration-Curve computed from Montsouris station located at 3 km from 411 412 Châtillon. 90% of these events are characterized by a frequent return period (between 1 month and 2 years, see Figure 4). Four storms have a return period exceeding 10 years 413 and among them, one event appears to be particularly rare with an intensity equal to 58 414

mm/h for a duration of one hour. In addition, the four most significant events that occurred in Trappes during the 2011-2012 campaign (and plotted in Figure 2) have been reported in Figure 4. Three of these events are characterized by a return period lesser or equal to 6 months representing very frequent rainfall. The highest is characterized by a one year return period. That means the hydrological model has been calibrated to reproduce common events and we assume it is able to represent correctly rarer events characterized by more intense precipitation.

Note that evapotranspiration data computed by the French Weather service in
Villacoublay were available for the same period and has been used as PET input (same
data as those used to calibrate and validate the green roof module, Section 2).

No automatic continuous stream gauge station is located on Châtillon basin. Nevertheless, a campaign was conducted from April to June in 2009 to evaluate the discharge at the outlet. The response to three rainfall events was registered. They all correspond to a total precipitation higher than 12 mm.

429

### 430 3-3 SWMM calibration on the current situation of the basin

431 Châtillon basin has been modelled in SWMM to correctly reproduce its hydrological behaviour. Its modelling representation and parameterization was provided by the 432 Hauts-de-Seine county that use it for operational issues. The basin is split into several 433 434 sub-basins (characterized by an average area of 10 ha, see Figure 3). Each sub-basin is divided in two areas (an impervious area and an infiltration area). Green roof surface is 435 deduced from the impervious area. Each discharge component (computed for remaining 436 impervious area, green roof area and infiltration area) is routed and summed at the sub-437 basin outlet. Each sub-basin contribution is then routed in the drainage network by 438

439 using geometrical information of the pipes.

The Châtillon basin representation has been tested on past events. Simulations have 440 been performed on three 2009 rainfall events for which temporal discharge observations 441 were made. SWMM simulations (see Figure 5) are satisfactory for this kind of rainfall 442 443 event with a good representation of the peak discharges and some Nash efficiencies higher than 0.85. Whereas these rainfall events are common ones –and in the absence of 444 additional information and further validation/calibration on more severe events- it has 445 446 been assumed that the model will be able to simulate the hydrological basin behaviour for more severe events (for which green roof effect will be lower). 447

448

#### 449 3-4 Green roofing scenarios

To estimate the potential of green roofing, land use (IAU-IDF, 2008) and building data (IGN, 2011) have been combined. Some specific classes of the land use database have been selected assuming green roof could potentially be implemented. The hypothesis has been made that every building belonging to these classes are mainly covered by flat roofs and therefore are able to become green roofs: collecting housing, industrial and economic activities, public buildings, equipment... In each class, the roof areas have been deduced by identifying the building areas from the IGN database.

Finally, the potential of green roofing is defined as the sub-basin area that could be covered by green roof (Figures 3-b and 3-c). It is a high estimation of the real green roofing potential since it assumes that all selected buildings are effectively covered by a flat roof, without micro-structure and where green roof can technically be implemented (and is not already implemented). These potentials also represent a maximum value for which green roofing scenarios will be deduced by selecting a part of it.

In the Châtillon basin, the potential of green roofing appears to vary significantly from one sub-basin to another (Figure 3) with an average value of 1.6 ha (representing 17% of the sub-basin area). The downstream part (where individual houses are located) is characterized by a potential close to 0 ha, whereas almost all the sub-basins located upstream to the Boulevard de Vanves have a higher potential locally reaching more than 5.6 ha (corresponding to 50% of the basin area).

Different green roofing scenarios have been provided, based on the potential of green 469 470 roofing computed at the sub-basin scale. They correspond, for every sub-basin, to the uniform covering of 12.5, 25, 50 and 100% of the green roofing potential with a SE3Y 471 or a SE15Y configuration. In addition to these 8 green roofing scenarios, a scenario 472 corresponding to the current situation without any green roof infrastructure is used to 473 evaluate the impact of green roofing (called "Reference" for now on). In SWMM, the 474 green roof surfaces are subtracted from the impervious areas at the sub-basin scale. The 475 green roof module, previously integrated into SWMM, is used to compute runoff for 476 477 these particular surfaces. Acting in parallel, discharges computed for every contributing 478 surface are added to provide the total sub-basin response.

479

#### 480 **4-Methodology**

To assess the hydrological impacts of green roofs on urban runoff and to identify the main variables influencing these impacts, a two-step methodology has been established.

Firstly, the SWMM model has been applied at two scales: (i) on a virtual 35 m<sup>2</sup> green roof similar to the experimental site, (ii) on Châtillon basin. In both cases, the model was run continuously by using the 9 previously defined green roofing scenarios on the 1993-2011 time period including the 54 rainfall events. Note that 12.5, 25, 50 and 100% scenarios refer to the percentage of green roofing potential that is effectively covered at both scales. As the virtual roof and basin are characterized by different green roofing potential, the percentage of the total covered surfaces differs for both cases. Concerning the virtual roof, the reference configuration represents a completely impervious surface; the 100% green roofing scenario represents the current infrastructure set up in Trappes. Concerning Châtillon basin, 12.5, 25, 50 and 100% scenarios refer to the coverage of 2.5, 5, 10 and 20% of the basin area.

For operational purposes, this study has been focussed on the hydrological impacts of green roof. These impacts of green roof has been evaluated though the relative difference in terms of peak discharge ( $\Delta Qp$ ) and runoff volume ( $\Delta V$ ) with the reference situation for each rainfall event (expressed in percentage):

498 
$$\Delta Qp = \frac{(Qp\_ref - Qp\_ref)}{Qp\_ref} \times 100$$
(Eq. 14)

499 
$$\Delta V = \frac{(V\_ref - V\_ref)}{V\_ref} \times 100$$
(Eq. 15)

Where  $Qp\_ref$  and  $V\_ref$  refer to peak discharge and runoff volume computed for the reference situation whereas  $Qp\_veg$  and  $V\_veg$  correspond to those computed for the different green roofing scenarios.

As mentioned above, virtual roof and Châtillon basin are not characterized by the same green roofing potential. Moreover, at the building scale, a roof is completely covered or not by green roof in practice. In this study, the use of progressive covering scenarios aims to compare the simulated hydrological impacts at both scales. The objective of this comparison is to study how the impacts noticed at the roof scale (that can be completely covered by green roof) can be transposed at the basin scale (that can only partially be 509 covered) taking into account the scale effect.

510

Secondly, the main variables influencing the hydrological impacts of green roof at both scales (in terms of peak discharge and runoff volume reduction) have been studied. The aim of this work was to compare and eventually to link and/or predict the hydrological impacts assessed at the roof and the basin scales.

In order to analyse how the rainfall event characteristics, but also the antecedent 515 conditions, influence the green roof impact, the relationship between several 516 517 hydrometeorological variables and the maximum reduction of runoff has been studied. Note that the maximum reduction corresponds to the larger peak discharge or runoff 518 519 volume reduction obtained for the different green roofing scenarios. For each of the 54 520 events, the computed hydrometeorological variables are: maximum 5, 30 and 60 minutes precipitation intensity (Imax5, Imax30 and Imax60), total amount of 521 precipitation (Ptot), rainfall event duration (Durat), antecedent precipitation 522 accumulated during the 15 previous days (Pant), and estimated soil saturation at the 523 beginning of the event (SoilSat, represented as the level of the SE3Y and SE15Y 524 substrate reservoirs). Note that every variable has been statistically normalised by 525 subtracting the mean and dividing by the standard deviation for the remainder of this 526 527 study. Results of the regression on normalized data allow easier comparison of 528 coefficients to determine relative importance in their predictive power.

529 The direct correlation coefficient has been calculated between each hydrometeorological variable and each hydrological impact ( $\Delta Qp$  and  $\Delta V$  for SE3Y and 530 531 SE15Y). Then a multiple stepwise regression analysis (Brown, 1998) was undertaken to identify the variables which best explain and predict the hydrological response 532

fluctuations minimizing variables redundancy. An  $(n \times p)$  matrix consisting of n=54533 events and p=7 variables was constructed. Then,  $(p \times p)$  correlation (COR) and 534 significance (*p*-value) matrices were constructed using statistical software in Matlab. To 535 assess the statistical significance, we accepted correlations with *p*-value <0.05 using the 536 Student t-test. Finally, multiple stepwise regression analysis generates a linear equation 537 that predicts a dependent variable (hydrological impacts) as a combination of several 538 independent variables (hydrometeorological variables). A final correlation coefficient 539 has been calculated to assess the linear combination of the selected variables and its 540 power of predictability. This procedure has been applied on both scales (virtual roof and 541 542 Châtillon basin).

In this study, a linear model has been chosen because dependent variables are expressed 543 as relative differences and not directly as hydrological responses (discharge or volume) 544 for which a multipower model is needed (Bois and Obled, 2003). Furthermore, it is 545 clear independent variables are not normally distributed. But despite its limitations, 546 multiple regression analysis represents a simple model sufficient to capture a significant 547 548 fraction of the impact variability as it was done in other studies under similar conditions 549 (Drasko, 1998; Berger and Entekhabi, 2001; Nie et al., 2011). For this reason, it will be used to analyse and compare the different hydrological impacts computed at both scales. 550

551

### 552 **5- Assessment of the hydrological impact of green roof**

553 5-1 Impact at the green roof scale

First of all, it has to be noticed that the hydrological responses of SE3Y and SE15Y configurations for the considered 54 events are quite similar for the different green roofing scenarios (It has already been noticed on the experimental site for the four main

events, see Figure 2). The decrease in peak discharge due to green roofing appears to be 557 558 higher for SE15Y (around 10% higher). The hydrological response for both configurations essentially differs for the low precipitation events. Most of the smallest 559 events do not produce any response for the SE15Y configuration (for only 10 of the 40 560 lowest events in terms of rainfall accumulation, see Figure 6) while small runoff is 561 generated for the SE3Y one (for 32 of the same events). Concerning the highest events, 562 discharge tends to reach the same peak value. This has already been mentioned on the 563 experimental green roof for the highest event of 20 mm (see Section 2-1). For this 564 reason and for a question of readability, only the results provided with the SE15Y 565 566 configuration are represented in the next figures.

As expected, the reduction of the hydrological response depends on the level of green 567 roofing: the higher the covering, the higher the reductions in terms of peak discharge or 568 volume (see Figure 6). As the percentage of green roof is greater than that defined at the 569 sub-basin scale (here, the potential represents the entire area whereas at the basin scale a 570 potential of 100% represents 20% of the total area), the hydrological impact of green 571 roof is significant. As already mentioned, most of the rainfall events (the smallest ones 572 573 in terms of total amount of precipitation) are completely retained by the 100% green roofing scenario: in this case, only 22 of the 54 rainy events produce runoff 574 575 (characterized by a total amount of precipitation ranging 10.6 mm to 112.8 mm). At the roof scale, reductions of peak discharge and runoff volume are of the same order of 576 magnitude: about 10% (ranging 6% to 12%) for a covering of 12.5% of the roof, about 577 20%, 40%, and 85% (ranging 13% to 25%, 37% to 50% and 10% to 100% for peak 578 discharge) for a covering of 25%, 50% and 100% of the roof area respectively. 579

580

Surprisingly, for some particular events (N° 35, 36, 49 and 51 in Figure 6), some green 581 582 roofing scenarios can produce a higher peak discharge (meaning a negative value of  $\Delta Qp$ ) than the one generated by the entire impervious surface (or a smaller coverage 583 scenario). An example of this situation is presented in Figure 7 (note that the other ones 584 are similar to this event). This rainfall event that occurred on 1 December 2010 is 585 characterized by a double rainfall peak spaced in time by 10 minutes (55.2 mm/h and 586 64.8 mm/h respectively). The total impervious roof responds identically with two peak 587 discharges reaching 0.45 l/s and 0.61 l/s respectively. As expected, the crescent 588 covering of green roof tends to reduce both peaks (12.5% and 25% green roofing 589 590 scenarios generate a reduction of peak discharge of about 12% and 22%). The 50% covering implies also a significant decrease for the first peak and a less significant one 591 for the second peak, combined with a 10-minute delay. This trend is also amplified with 592 593 the 100% green roofing scenario. The first rainfall peak is completely stored in the green roof, but the second part of the event generates a peak discharge  $(0.61 \text{ m}^3/\text{s})$ 594 higher than that produced by the total impervious roof. This is due to the concomitance 595 of the fast response of the saturated substrate generated by the second rainfall and the 596 slow response of the green roof produced by the first rainfall. 597

598

#### 599 5-2 Impact at the basin scale

As already mentioned for the virtual roof, the difference between SE3Y and SE15Y configurations impacts are not completely negligible. Comparing to the results obtained for SE3Y, the use of SE15Y green roof implies an additional reduction of peak discharge ranging 0.3% (for 12.5% potential covering scenario) to 2.3 % (for 100% potential covering scenario). Although this difference varies from a rainfall event to another, it never reaches more than 10% for a same event (respectively 15% for thevolume).

The simulated peak discharges appear to be influenced by the implementation of green 607 roofs when significant roof surface is covered. Hydrological responses computed for the 608 609 different green roofing scenarios on the study basin have been represented from smallest to largest in Figure 8. Although the impact of green roof varies from one storm 610 event to another, the covering of only 12.5% on the green roofing potential implies a 611 612 small reduction of the peak discharge (average value of 4.7%, from a minimum of 0% to a maximum of 5.5%). This reduction of peak discharge slightly increases with the 613 covering of 25% (the reduction ranges from 3.5% to 10.2% with an average value of 614 9%). For both low green roofing scenarios, the impact on runoff volume is quite 615 negligible with an average decrease of 6.6% in the best case (25% covering scenario). 616

High green roofing scenarios (covering of 50 or 100% of the potential) have more 617 valuable consequences in terms of runoff reduction. The 50% scenario leads to an 618 average peak discharge decrease of about 18.6% (from a minimum of 9.3% to a 619 maximum of 23.7% depending on the event). The impact of the 100% scenario looks 620 621 proportional with an average Qp reduction of 35.6% (between 17.4% and 38.7%). The runoff volume is also significantly reduced with an average value of 25.2% for the best 622 623 case, and a stronger fluctuation from a storm event to another (from 14.4% to 53.9%). Indeed, the hydrological benefit seems to be directly related to the storm event. From an 624 operational point of view, green roofing of a significant part of the buildings' roofs 625 implies the reduction of the flooding risk: 14 rainfall events (on 54) now have a peak 626 discharge lower than the flooding threshold of 4.7  $m^3/s$  for the 50% scenario, and 26 627 events for the 100% scenario respectively. 628

The situation presented in the previous section, where peak discharge is increased by the use of green roof, does not occur at the basin scale. It is explained in part by the specific configuration of the case study, especially the spatial repartition of the impervious and green roof surfaces and the attenuation effect of the sewer network.

633

#### 5-3 Correspondence between virtual roof and basin impacts

When comparing results obtained for virtual roof and Châtillon basin, green roof impacts (on peak discharge or runoff volume) appear to not perfectly match from one rainfall event to another. The sensitivity to green roof implementation and the magnitude of these impacts is clearly different because the average green roof potential is 20% on the study basin while it represents the entire area on the virtual roof. For this reason, in many situations, runoff is completely avoided on the virtual roof, whereas it is only reduced (at most 40%) on the basin.

Nevertheless, both studied surfaces follow more or less the same trend, and differences 642 seem to be devoted to the specific configuration of the sewer network and layout 643 between impervious and green roof surfaces. Although green roof can reduce the 644 hydrological impact of stormwater, these consequences are conditioned by the intrinsic 645 properties of the studied basin. The main difference occurred for two severe rainfall 646 647 events characterized by a total accumulation of 63.8 and 112.8 mm for a duration of 65 and 515 minutes respectively (Events No 50 and 52, see also Figure 4) for which the 10-648 year return period was exceeded. In these situations, the impact noticed at the roof scale 649 is significantly attenuated at the basin scale. The influence of remaining impervious 650 areas and the saturation of the substrate seem to cancel runoff reduction abilities of 651 green roof. 652

At both scales (roof and basin), hydrological impact of green roof seems also to be related to the specific characteristics of the rainfall event. Regarding Figures 6 and 8, the relative reduction of peak discharge seems to be higher for the smallest events in terms of rainfall amount. This observation that has already been mentioned in previous studies (Carso*n et al.*, 2013; Fassman-Bec*k et al.*, 2013) and will be studied in detail in the following.

659

## 660 6-Condition of urban runoff reduction

Simple correlation and multiple stepwise regression analysis have been undertaken to identify which variables (*Imax5, Imax30, Imax60, Ptot, Durat, Pant, SoilSat,*) can explain and can predict hydrological response fluctuations ( $\Delta Qp$  and  $\Delta V$ ) minimizing variables redundancy.

665 6-1 At the virtual roof scale

Regarding the single correlation coefficients (Table 2), precipitation seems to be an 666 important factor influencing the hydrological response. Despite the 5-minute time 667 period being close to the response time of the virtual roof (assessed from observation on 668 669 Trappes' roof characterized by a time to peak reaching 3 to 6 minutes), the accumulations on higher time periods (one hour or on total event duration) seem more 670 predominant. As mentioned in recent studies (Carson et al., 2013; Fassman-Beck et al., 671 672 2013), the higher the precipitation, the lower the hydrological impact (in terms of reduction of peak discharge and runoff volume). These durations are usually close to the 673 time separating the end of rainfall and the end of runoff (observed as being higher than 674 30 minutes). 675

Whatever the green roof configuration, the duration of the event and the antecedent precipitation are weakly correlated with hydrological responses. Antecedent conditions seem to be better represented by the substrate saturation at the beginning of the event. The correlation with this variable is also higher for the thicker substrate (around 0.70) meaning the SE3Y configuration response does not depend much on initial conditions. As it has a smaller water retention capacity, substrate generally has time to dry between two events and it is rapidly saturated for the most severe events.

683 The multiple stepwise regression analysis selects almost the same hydrometeorological variables to optimize the multilinear correlations (see Table 2): total rainfall 684 accumulation and estimated soil saturation at the beginning of the event for peak 685 discharge reduction. An additional variable (Imax60) influences runoff volume 686 reduction. As Imax5, Imax30, Imax60 and Ptot are strongly correlated, only one or two 687 variables among them are considered as statistically significant at the <.05 level. The 688 selection of Imax60 and Ptot for volume reduction can be interpreted as follows: the 1-689 hour accumulation close to the concentration time of the roof. If the rainfall event 690 691 continues after this duration, most of the precipitation becomes directly runoff, 692 influencing the total volume.

693 The final correlation computed by using the selected variables is quite good for both 694 configurations and both hydrological impacts (from 0.68 to 0.90). The scatter plots comparing observed and simulated hydrological impacts are presented in Figure 9. Most 695 of the points are located close to the symmetric line. Two main reasons can be proposed 696 in order to explain the different outliers and the difficulty for the multilinear relationship 697 698 to reproduce some specific situations. First, the threshold effect is noticed for several events for which no runoff is produced by the SE15Y configuration ( $\Delta Qp$  and  $\Delta V$  are 699 equal to 100%). Second, singular behaviours can occur as those produced by 700

concomitance situations (as shown in Section 4-2): in these cases, two consecutive
peaks of rain produce a peak discharge reduction not significant as expected, and can
sometimes amplify the reference situation.

Similar regression analysis was performed by Stovin et al. (2012) for similar results. 704 705 They tried to link several hydrometeorological variables to the direct hydrological consequence of green roof and not the relative differences as in this study. Total rainfall 706 accumulation appeared to be linked to runoff depth and percentage of retention 707 708 (correlation coefficients of 0.72 and 0.33 respectively). The influence of antecedent dry weather period seemed to be more complex and the combination of several variables 709 showed it was not to possible to predict retention depth for a particular 710 hydrometeorological situation. 711

712

#### 713 6-2 At the Châtillon basin scale

At the basin scale, the results of correlation are quite similar to those obtained at the virtual roof scale. As expected, precipitation is strongly correlated to the peak discharge reduction (the higher the total precipitation, the lower the reduction), while runoff volume reduction is hardly explained by the independent variables. Only the antecedent condition in terms of estimated soil saturation seems to influence the volumetric response and is considered as statistically significant at the *p*-value<0.05 level.

The multiple stepwise regression analysis selects almost the same hydrometeorological variables as at the roof scale (see Table 2): total rainfall accumulation and estimated soil saturation at the beginning of the event. Note that despite their strong correlation, *Imax30, Imax60* and *Ptot* are selected to explain the peak discharge reduction for SE3Y configuration. They correspond to different scales of the basin response. Nevertheless, these results from multiple stepwise regressions should be interpreted with some caution because of: (i) the limited sample data (54 events for 7 independent variables), (ii) the clearly non-normal distribution of these variables, and (iii) few outliers due to singular behavior.

The comparison between simulated and stepwise computed hydrological impacts is also well represented on the scatter plots (Figure 10). The peak discharge impacts are well depicted around the symmetric line and only a few events are located far from the median values. They correspond to the two main events characterized by a total rainfall accumulation of 112.8 mm and 63.8 mm. It appears the basin is able to smooth a large majority of the events and only react to the extreme ones.

The distribution of total runoff volume is more erratic with a wide dispersion around the symmetric line. Estimated soil saturation at the beginning of the event is the only selected variable explaining  $\Delta V$  fluctuations for the SE15Y configuration. This variable is characterized by low fluctuations (ranging from 12% to 35% for an average value of 17%). As a consequence, many volume reductions are estimated by a constant simulated value, representing an unsaturated substrate at the beginning of the event.

741

6.3 Is roof scale impacts a good indicator to predict basin scale impacts?

Obviously, green roofing impacts are easier to observe at roof scale than at basin scale. In addition, previous results have shown that the main hydrometeorological factors influencing hydrological impacts are quite similar at both scales: initial soil moisture condition and intensity or accumulated precipitation. In order to appreciate how estimated results at roof scale may help to predict impact at the basin scale, the hydrological impacts noticed at the basin scale have also been compared to those

computed at the roof scale by using the multi-linear regression (Figure 11). Although 749 750 correlation coefficients are always lower than those obtained by using the multi-linear regression calibrated at basin scale, they provide satisfactory results. It appears 751 correlation coefficients are higher for peak discharge concerning SE3Y (0.84) and for 752 runoff volume concerning SE15Y (0.71) respectively. This is due to the common 753 selected hydrometeorological variables (characterized by high correlation) shared by 754 both case studies: *Ptot* and *SoilSat* for  $\Delta Qp$  and *SoilSat* for  $\Delta V$ . These results show that 755 impacts estimated at roof scale can globally approximate those expected at basin scale 756 for a large set of rainfall events by using a reduction coefficient. This approximation can 757 758 appear quite rough but can be useful to have an idea of the consequence of green roof at 759 the basin scale.

760

#### 761 **7-Discussion**

These encouraging results provided by a modelling approach are based on a number ofimplicit hypotheses and limitations that can be discussed:

(1) The SWMM representation of green roof at the sub-basin scale. First, the 764 estimation of the green roofing potential may look optimistic. The methodology 765 used probably overestimates the real potential. It is assumed that all buildings 766 belonging to the selected land use categories can effectively be covered by green 767 roof, meaning that they have flat roofs, without micro-structure and for which 768 the implementation of green roof is technically possible (and already done). The 769 consideration of only a fraction of this potential seems to be more realistic. For 770 this reason, these results illustrate the potential of such structures and encourage 771 the implementation of green roofs for future rehabilitation and developing 772

projects. Second, green roof areas are considered as a unique entity at the subbasin scale (mean area of 10 ha), without taking into account the spatial distribution of the green roof covered buildings. This may impact the dynamic of the response by using the Manning-Strickler equation on a virtual area representing the sum of the different covered roofs. For this reason, we assume such a representation is adapted to assess the hydrological impact of green roof at the basin scale but surely not at the sub-basin one.

780 (2) The short time period for the calibration of the hydrological model. The model parameters have been adjusted by using 1-year observation data during which no 781 severe event was observed (the maximum exceeded return period is equal to 1 782 year). That means the model has been calibrated on common events, and we 783 assume it is able to correctly represent rarer events characterized by more 784 intense precipitation. This could explain why hydrological impacts computed for 785 extreme events are often located far from the regression line (linking SWMM 786 simulated and stepwise computed hydrological impacts). For this reason, the 787 788 observation of experimental green roofs has to continue in order to capture more significant storm events. These additional data will be used to improve and/or 789 validate the model in the future. However, the use of current data allows us to 790 conclude that the implementation of green roof can be useful to limit the 791 consequences of common storm events on sewage network. Moreover, 792 evapotranspiration has appeared as a key factor influencing initial substrate 793 saturation during wet periods. The improvement of its estimation could improve 794 model simulations. 795

(3) The specific configuration of the studied basin. The presented results have beencomputed for a particular urban basin belonging to the Hauts-de-Seine county.

For this reason, the figures obtained in terms of flooding reduction can not be 798 799 generalized and transferred to other locations. Indeed, they depend on the basin configuration, especially on green roofing potential (with the diffusion more or 800 less significant of flat roof), the combination of impervious and green roofing 801 surfaces, but also on the basin geometry and the sewage network arrangement. 802 For these reasons, it is quite possible that some concomitance situations occur as 803 noticed at the roof scale in Section 4-2. The superposition of responses from an 804 impervious area and a green roof area to a complex rainfall event (composed by 805 several rainfall peaks for example) can generate a peak discharge higher than 806 807 that produced by the current (impervious) situation.

808

#### 809 8-Conclusions

810 Based on experimental green roof observations, a conceptual hydrological model has been developed and calibrated to reproduce the hydrological behaviour of two different 811 812 types of green roof differentiated by their substrate depth. On the other side, several green roofing scenarios have been produced for a small urban basin, ranging from the 813 current situation (no green roof is implemented) to a maximum roof area that can be 814 815 covered by green roof. Integrated into the stormwater management model SWMM, the 816 conceptual hydrological model has been applied on a large time series at the basin scale to assess its impact in terms of urban water management. For comparison, the same 817 818 procedure has also been applied at the roof scale. Finally, a complementary analysis has been conducted to study which hydrometeorological variables can influence the 819 magnitude of these hydrological impacts at both scales. 820

821 Whether at the scale of roof or basin, green roof appears to significantly impact urban

runoff in terms of peak discharge and volume. At the roof scale, the obtained results for 822 a complete green roof covering (reduction close to 90% for peak discharge and runoff 823 volume) are similar to those provided by experimental studies (Voyde et al., 2010; 824 Palla et al., 2011 ; Stovin et al., 2012). At the basin scale of our case study, results are 825 less pronounced because they depend on the green roofing potential of each sub-basin, 826 which usually represents around 20% of the sub-basin area (2.37 km<sup>2</sup>). The reduction of 827 the hydrological response (peak and volume runoff) can reach almost 20% when half of 828 the potential is covered and more than 35% for the entire area. It seems to be enough to 829 avoid some flooding issues in several cases as demonstrated on our case study: for 14 of 830 831 the 54 considered rainfall events, modified peak discharge are then lower than the 832 flooding threshold with the 50% green roofing scenario.

It has also been noticed that the response of the two SE3Y and SE15Y green roof 833 configurations (substrate depth of 3 and 15cm) for the 54 studied events are quite 834 similar. The hydrological responses of both configurations essentially differ for the low 835 precipitation events, for which the thicker substrate produces less runoff. For the highest 836 ones, both peak discharges and runoff volumes are of the same order. This has already 837 been observed on the experimental green roof for the more intense events, but also in 838 some previous studies. Voyde et al. (2010), for example, mentioned that an increase in 839 840 substrate depth from 50 mm to 70 mm did not provide a measurable increase in hydrological performance. 841

By comparing several hydrometeorological variables relative to the rainfall events with the hydrological impacts of green roof (at roof and basin scale), it appears that precipitation –generally accumulated during the whole event- and initial substrate saturation are both influencing variables: the higher the precipitation, the more saturated the substrate, and the lower the reduction in terms of stormwater. The use of green roof seems to be helpful to mitigate the effects of a rainfall event characterized by a return period lower than 10 years. For the more severe events, the impact of green roof is marginal and can not be used to solve operational issues.

At both scales (roof and basin), it appears difficult to forecast the hydrological impacts 850 851 of green roof only by considering hydrometeorological variables. Multilinear relationships approximate responses (in terms of peak discharge and runoff volume) to 852 storm water, but they fail in reproducing them correctly for a large kind of rainfall event 853 854 and antecedent condition configurations. They need a more physical tool (a hydrological model) to estimate the consequences of the involved non-linear processes. Moreover, 855 the basin response seems to be deeply influenced by its own configuration. 856 Nevertheless, in a first approximation, the multi-linear relationship adjusted for the roof 857 can provide correct estimation at the basin scale. 858

Despite some limitations mentioned in the previous section, this study supports the large 859 scale implementation of green roofs to locally reduce overflows in the drainage 860 network. In addition to possible thermal and environmental benefits, green roof can be 861 valuable from an urban water management point of view. As already mentioned in other 862 863 studies (Carter and Jackson, 2007), green roofs alone cannot solely be relied upon to provide complete stormwater management at the watershed scale. Combined with other 864 865 stormwater source controls or/and retention infrastructures, green roof could contribute to significant reductions of the quantity of water flowing into the sewage network 866 during storm events. A combination of source control management strategies and water 867 reuse techniques are more cost effective than their traditional centralized counterpart 868 869 (Coombes et al., 2002). As a result, this kind of study could be used by policy makers and water management authorities to promote the dissemination of green roof in the 870 871 future.

#### 873 Acknowledgments

- This work has been supported by the French C2D2 framework programme through the
- 875 TVGEP project. The authors would like to thank the Water Direction of the Haut-de-
- 876 Seine county, especially Pascal Jouve, Christian Roux and Christophe Lehoucq, for
- 877 providing geographical and hydrometeorological data and expertise.

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Figure 2: Comparison between observed and simulated discharges computed at the roof scale. Results obtained for the four most severe events of the study period (June 2011-

1010 August 2012) are presented for SE3Y (top) and SE15Y (bottom) green roof 1011 configurations.

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Figure 3. Châtillon basin disaggregated into 25 sub-basins for SWMM modelling: a)
land use distribution, b) potential roof surfaces distribution, c) green roofing potential
distribution



Figure 4. Characterization of the studied rainfall events in terms of duration and intensity, IDF curves from Montsouris (Paris, France) are indicated. The 54 events computed from Hauts-de-Seine database on the 1993-2011 period are represented by crosses and those computed from the experimental green roof in Trappes on the 2011-12 period are represented by squares.



Figure 5: Comparison between observed and simulated (with SWMM) discharge computed at the Châtillon basin scale. Simulations were performed on three 2009 rainfall events for which temporal discharge observations were available.



Figure 6. Impact of the green roofing scenarios on the  $35 \text{ m}^2$  virtual roof: peak discharge is represented for the 54 rainfall events (ordered by increasing value of Qp), the average reduction in peak discharge ( $\Delta Qp$ ) and runoff volume ( $\Delta V$ ) are indicated for the four green roofing SE15Y scenarios. The total amount of precipitation is also represented for every event (bars on inverse axes) and the particular events for which the implementation of green roof produces higher peak discharge are surrounded.



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Figure 7. Hydrological response of the virtual roof for different greening scenarios on the 1st December 2010 rainfall event. Precipitation is represented, in blue, on the inverse axes. Runoff coefficients (RC) are also indicated.



Figure 8. Impact of the green roofing scenarios on the basin: peak discharge is represented for the 54 rainfall events (ordered by increasing value of Qp): the average reduction in peak discharge ( $\Delta Qp$ ) and runoff volume ( $\Delta V$ ) are indicated for the four SE15Y scenarios. The total amount of precipitation is also represented for every event (bars on inverse axes).



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Figure 9. Comparison between SWMM simulated (sim) and stepwise computed (reg) hydrological impacts ( $\Delta Qp$  and  $\Delta V$ ) at the virtual roof scale for SE3Y and SE15Y configurations and the 100% green roofing scenario (the solid line corresponds to the x=y symmetric equation).



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Figure 10. Comparison between SWMM simulated (sim) and stepwise computed (reg) hydrological impact ( $\Delta Qp$  and  $\Delta V$ ) at the basin scale for SE3Y and SE15Y configurations and the 100% green roofing scenario (the solid line corresponds to the x=y symmetric equation). The two more intense events are surrounded.



Figure 11. Comparison between SWMM simulated (sim) at the basin scale and stepwise computed at the roof scale (reg) hydrological impact ( $\Delta Qp$  and  $\Delta V$ ) for SE3Y and SE15Y configurations. The 100% green roofing scenario (the solid line corresponds to the x=y symmetric equation).

## 1070 Table captions

1071 Table 1. Calibrated parameters values for both SE3Y and SE15Y. Physical values

1072	provided by §	green roof	supplier an	re indicated	for comparison.
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		f_sub	FC	Ksat (mm/h)	R
SE3Y	Physical	0.4	0.4	1158	~ 0.4
	Calibrated	0.4	0.39	104.7	0.51
SE15Y	Physical	0.4	0.4	1158	~ 0.4
	Calibrated	0.4	0.21	2.0	0.65

Table 2. Correlation between the hydrological impact and several hydrometeorological variables for virtual roof (top) and the Châtillon basin (bottom): The variables selected by the stepwise procedure are marked in bold. The last column represents the final correlation coefficient computed by using these selected variables.

At the roof scale								
	Imax5	Imax30	Imax60	Ptot	Durat.	Pant.	SoilSat	COR
ΔQ_SE3Y	-0.47	-0.69	-0.67	-0.71	-0.44	-0.24	-0.36	0.75
ΔV_SE3Y	-0.38	-0.49	-0.48	-0.54	-0.45	-0.27	-0.44	0.68
$\Delta Q\_SE15Y$	-0.50	-0.71	-0.69	-0.69	-0.40	-0.38	-0.68	0.90
$\Delta V_SE15Y$	-0.50	-0.46	-0.46	-0.50	-0.34	-0.44	-0.76	0.89
At the basin scale								
	Imax5	Imax30	Imax60	Ptot	Durat.	Pant.	SoilSat	COR
ΔQ_SE3Y	-0.62	-0.84	-0.79	-0.78	-0.40	-0.14	-0.31	0.88
ΔV_SE3Y	-0.23	-0.25	-0.22	-0.27	-0.26	-0.27	-0.42	0.52
ΔQ_SE15Y	-0.50	-0.76	-0.81	-0.86	-0.54	-0.06	-0.12	0.86
$\Delta V_SE15Y$	-0.22	-0.12	-0.10	-0.13	-0.14	-0.45	-0.72	0.72