| 1 | A long-term hydrological modelling of an extensive green roof |
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| 2 | by means of SWMM |
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10 ABSTRACT

11 Green roofs provide multiple environmental and social benefits, among which the opportunity to control storm water runoff as they limit the rate of runoff after urbanization 12 13 to the rate that would have occurred before urban development. The hydrological 14 behavior of a green roof is site specific, thus the local environmental parameters, the characteristics of the vegetation and the physical properties of its layers have to be 15 16 considered in the evaluation of its performance. Furthermore, the hydrological 17 performance of a green roof is influenced by the size of the plot (full-scale vs small scale), 18 by the definition of "event", and by the number of events included in the research. From 19 this broader context this paper first provides a review of the scientific literature, with a 20 focus on the hydrological behaviour of experimental full-scale installations and on 21 hydrological modelling of green roof performance. Second, the study presents the results 22 of a monitoring activity of a full-scale extensive green roof in Bologna (Italy). Continuous 23 weather data and runoff were collected between January and December 2014, resulting

24 in 69 storm events suitable for the study. Experimental data show that single event rainfall 25 attenuation ranged from 6.4% to 100% with an annual average value of 51.9% which is 26 consistent with other author's findings. Last, the study uses the field data to calibrate and 27 validate a numerical model realized with the commercial software SWMM 5.1. The 28 model was used to simulate the long-term hydrologic response, over one year, of the same 29 full-scale extensive green roof and to compare it to an adjacent impervious roof of the 30 same size. Modelling results confirm the role of green roofs in restoring the natural water 31 regime by reducing the annual runoff volume. The comparison of the results between the 32 experimental green roof monitoring and the SWMM simulation proved that the suggested 33 model has good capabilities in simulating the hydrograph of stormwater runoff from 34 green roofs along the year, as demonstrated by the quite high values of NSE and the low 35 value of RSR in both the calibration and validation phase. Furthermore, the low difference 36 (< 9%) in total retention between the 69 measured and simulated events confirms the 37 suitability of the model for long term simulations. The proposed modelling approach 38 demonstrates that SWMM can be used for assessing the performance of LID systems 39 (Low Impact Development), and consequently for supporting local authorities or 40 designers in the evaluation of the hydrological efficiency of green roofs.

41 **KEYWORDS**

42 Green roof; LID, modelling; retention; stormwater management; SWMM^{*}

* Abbreviations: BRC-LID: "Bio-Retention Cell" LID Type; ET₀: potential evapotranspiration, ET_r: real evapotranspiration; GR: Green Roof; LID: Low Impact Development; GR-LID: "Green Roof" LID Type; NSE: Nash–Sutcliffe Efficiency index;

43 **INTRODUCTION**

A green roof (GR) is an extension of an existing or newly constructed roof which 44 45 incorporates a multi-layer structure (water proofing membrane and root barrier, a filter, a 46 drainage system and lightweight growing medium) and plants. The growing popularity 47 of GRs in sustainable buildings is mainly due to their multiple environmental and social 48 benefits (Bianchini and Hewage, 2012; Vijayaraghavan, 2016), among which the 49 hydrological ones. It is repeatedly documented that GRs are a valid tool to restore the 50 hydrological urban water balance by reducing and delaying stormwater runoff (Czemiel 51 Berndtsson, 2010; Palla et al., 2010; Stovin et al., 2015, 2012). Furthermore, a GR acts 52 as a Source Control technology (SC) providing a stormwater management opportunity in 53 otherwise unused spaces: the rooftops. (Fassman-Beck et al., 2013; Fletcher et al., 2014; 54 Versini et al., 2015). As a result, quantifying and improving the hydrological performance 55 of a GR system is becoming increasingly important for stormwater engineers, architects 56 and urban planners (Berardi et al., 2014; Czemiel Berndtsson, 2010; Fassman-Beck et al., 57 2013; Gambi et al., 2011; Lucas and Sample, 2015; Mentens et al., 2006; Stovin et al., 58 2012; Voyde et al., 2010b).

59 Stovin et al. (2012) clearly identified the key hydrological mechanisms operating within 60 a GR; they could be summarized in: rainfall interception by leaves, infiltration and 61 retention in the substrate, storage in the drainage layer, and runoff from the detention 62 storage. Any excess of water, above retention capacity, is directed from the drainage layer

RMSE: Root Mean Square Error; RR: Reference roof; RSR: RMSE-Observation Standard deviation Ratio; SC: Source Control technology; SR: Sedum Roof.

towards the downspouts, while retained water may subsequently leave the roof as evapotranspiration (Stovin et al., 2015). For improving the retention capacity, which to date is the most cited hydrological performance metric of a GR, a complete knowledge of these mechanisms is needed. Moreover, those processes must be carefully modelled to provide a valid prediction tool for stormwater engineers and municipalities in the design and verification phase, respectively.

Furthermore, in the past few years, due to a growing number of research studies (e.g. 69 70 Blank et al., 2013; Li and Babcock, 2014; for an overview) which demonstrate the 71 effectiveness of GRs from an ecological, social, and economical point of view, the local 72 regulations of many countries have begun to suggest GRs for many purposes, such as 73 urban stormwater management and urban heat island mitigation technologies. She and 74 Pang (2010) underlined how many European countries and local governments in the 75 United States are providing stimulus programs to promote GRs installation by private 76 buildings owners. This is mainly due to the fact that GRs should be considered as a 77 technology for providing an "all round" contribution as part of sustainable development 78 and resilience strategies. This concept has been deemed essential by the European 79 Commission through the HORIZON 2020 research program. At the moment the 80 European Commission promotes research activities "focused on providing evidence that 81 re-naturing of cities through the deployment of innovative, locally adapted, systemic 82 solutions - that are inspired and supported by nature - can be a cost-effective and 83 economically viable way to make cities more sustainable, resilient, greener, and healthier 84 (European Commission, 2015).

Currently, several Italian regional and local regulations (as in the Autonomous Province
of Bolzano, the Province of Rimini and in the city of Bologna through the Urban

Municipal Regulation, RUE) promote the use of GRs and other green technologies, because of their hydrological and environmental benefits, providing incentives such as extra building volumes or extra tax deductions (Bertocchi et al., 2011; Cipolla et al., 2016). It has therefore become essential to identify a method for forecasting the hydrological performance of GRs especially in order to fairly distribute such incentives.

92 **1.1** Overview of the retention performance of full-scale green roofs

93 Several studies evaluated the hydrological performance of GRs through field monitoring 94 activities, and their results have been compared by other authors through detailed 95 overviews (Czemiel Berndtsson, 2010; Palla et al., 2010; Stovin et al., 2012). However, 96 these authors frequently reported and compared the performance of GRs in terms of 97 average annual retention without taking into account the possible differences between 98 studies conducted on a pilot scale or on a full roof scale. Pilot scale studies are based on 99 elevated test beds or similar modules, with a watershed area that can range between 0.37 100 and 12 m² (Carson et al., 2013), while full-scale GRs typically occupy bigger watershed 101 areas and include non-vegetated regions, which are generally required for maintenance, 102 rooftop equipment, egress or load restrictions. Furthermore, the pilot test beds are 103 frequently elevated above the base level (Beecham and Razzaghmanesh, 2015; Stovin et 104 al., 2015, 2012) while full-scale installations lay on the rooftop. This means that in the 105 last case, the GR's contact with the atmosphere is restricted to the vegetation-air interface 106 while in the first case the bottom surface is usually not protected from weathering. These 107 differences, at the moment not fully investigated, may be the cause of inaccuracies when 108 comparing the overall retention of pilot test beds with full-scale installations. Moreover, 109 considering that not only the physical configuration but also other parameters could 110 influence the average retention (e.g. number of events, definition of events, climatic 111 condition at the study site, green roof type etc.), to reduce the inaccuracy from the 112 comparison between full-scale vs pilot green roof, from this point forward only studies 113 based on retention data provided by experimental studies on full-scale installations will 114 be taken into consideration.

115 Carson et al. (2013) proposed a detailed review of the hydrologic studies on full-scale GR 116 systems, in both entire and partitioned sections of occupiable building rooftops. This 117 review, updated with the results from the latest studies, is summarized in Table 1 and 118 shows that the retention volume can range from 11.0 % to 76.4 %, which is generally 119 lower than what reported for pilot test (Stovin et al., 2012). This is probably due, as 120 underlined by Carson et al., (2013) and work undertaken at Pennsylvania State University 121 (Berghage et al., 2007), to the presence of a gravel edge or non-vegetated sections and 122 irrigation requirements for many full-scale systems. Moreover, the presence of air and of 123 direct solar radiation to which many pilot test boxes are subject to on their bottom face, 124 may influence the evapotranspiration process and consequently the overall hydrological 125 performance (higher diurnal soil moisture loss).

| Year | Authors | Study Location | Period | Area | Events | Substrate depth | Ret. |
|------|---------------------------|----------------|---------------|------|--------|-----------------|------|
| | | | [mm/yy-mm/yy] | [m²] | | [cm] | [%] |
| 2003 | Hutchinson et al. (2003) | Portland, OR | 1/02-4/03 | 240 | NA | 100-125 | 69.0 |
| 2005 | Liu and Minor (2005) | Toronto, CA | 3/03-11/04 | 200 | NA | 75 | 57.0 |
| | | Toronto, CA | 4/03-11/04 | 200 | NA | 100 | 57.0 |
| 2005 | Moran et al. (2005) | Goldsboro, NC | 4/03-9/04 | 35 | 67 | 75 | 63.0 |
| | | Raleigh, NC | 7/04-9/04 | 65 | 13 | 100 | 55.0 |
| 2005 | Connelly et al. (2005) | Vancouver, CA | 1/05-12/05 | 33 | NA | 75 | 29.0 |
| | | Vancouver, CA | 1/05-12/05 | 33 | NA | 150 | 26.0 |
| 2007 | Teemusk and Mander (2007) | Tartu, EE | 8/04-9/04 | 120 | 3 | 100 | 19.6 |
| 2008 | Berkompas et al. (2008) | Seattle, WA | 2/07-12/07 | 743 | NA | 150 | 30.5 |

| | | Seattle, WA | 4/07-6/07 | 1860 | NA | 100-125 | 33.0 |
|------|-----------------------------|----------------|-------------|------|-----|---------|------|
| | | Seattle, WA | 10/07-12/07 | 80 | 9 | 150 | 17.1 |
| 2008 | Collins et al. (2008) | Goldsboro, NC | 4/03-6/04 | 35 | NA | 75 | 64.0 |
| 2008 | Kurtz Tim (2008) | Portland, OR | 5/02-6/08 | 246 | NA | 125 | 56.0 |
| | | Portland, OR | 3/07-6/08 | 465 | NA | 75 | 64.0 |
| 2008 | Spolek (2008) | Portland, OR | 10/04-4/07 | 290 | NA | 100-150 | 12.0 |
| | | Portland, OR | 10/04-4/07 | 280 | NA | 100-150 | 17.0 |
| | | Portland, OR | 1/05-10/07 | 500 | NA | 150 | 25.0 |
| 2009 | Berghage et al. (2009) | Chicago, IL | 8/07-7/09 | 7000 | 106 | 76 | 74.0 |
| | Bliss et al. (2009) | Pittsburg, PA | 8/06-1/07 | 330 | 13 | 140 | 21.8 |
| 2010 | Palla et al. (2010) | Genova, IT | 5/07-12/08 | 170 | 19 | 200 | 51.5 |
| 2010 | Voyde et al. (2010a) | Auckland, NZ | 10/08-10/09 | 41 | 91 | 50 | 66.0 |
| | | Auckland, NZ | 10/08-10/09 | 13 | 91 | 50 | 66.0 |
| | | Auckland, NZ | 10/08-10/09 | 46 | 91 | 70 | 66.0 |
| | | Auckland, NZ | 10/08-10/09 | 45 | 91 | 70 | 66.0 |
| | | Auckland, NZ | 10/08-10/09 | 12 | 91 | 70 | 66.0 |
| | | Auckland, NZ | 10/08-10/09 | 38 | 91 | 50 | 66.0 |
| 2011 | Gregoire and Clausen (2011) | Storrs, CT | 12/09-2/10 | 307 | NA | 102 | 51.4 |
| 2013 | Carson et al. (2013) | New York, NY | 06/11-06/12 | 310 | 74 | 32 | 36.0 |
| | | New York, NY | 06/11-06/13 | 390 | 108 | 100-200 | 47.0 |
| | | New York, NY | 06/11-04/14 | 940 | 61 | 100 | 61.0 |
| 2013 | Speak et al. (2013) | Manchester, UK | 09/11-10/12 | 408 | 254 | 170 | 65.7 |
| 2014 | Hakimdavar et al. (2014) | New York, NY | 08/11-1/12 | 310 | 113 | 32 | 50.6 |
| | | New York, NY | 8/11-06/12 | 99 | 110 | 32 | 61.3 |
| 2014 | Yang et al. (2015) | Beijing, CN | 04/12-7/12 | 120 | 13 | 150 | 76.4 |
| 2015 | Versini et al. (2015) | Paris, FR | 06/11-8/12 | 35 | 100 | 30 | 17.0 |
| | | Paris, FR | 06/11-8/12 | 35 | 100 | 150 | 11.0 |

126 Table 1. Summary of studies on the hydrological performance of full-scale GRs. Columns from left to 127 right identify: year of publication, authors reference, geographic location of the site, time period of data 128 collection, size of the monitored drainage area, number of individual events observed, depth of the 129 growing substrate, and average retention during the monitoring period for each study. The symbol NA is 131 It should be noted that not only the size of GRs (full-size vs pilot) but also other factors 132 such as the definition of the term "event", the number of considered events, the climatic 133 conditions, the substrate depth and composition, and last but not least the vegetation 134 planted, have a notable influence on the average retention of a GR. The definition of the 135 term "event" strongly influences the retention and consequently the performance of a green roof as source control technology. In some previous studies the individual events 136 137 were defined as being separated by continuous dry periods of at least six hours (Stovin, 138 2010; Stovin et al., 2013, 2012). For others, events were independent if separated by at 139 least one hour of dry weather time (Locatelli et al., 2014) and a few studies did not define 140 the minimum dry weather time before each event (Teemusk and Mander, 2010; Yang et 141 al., 2014). When the antecedent dry weather time increases, small events (with retention 142 equal to 100%) are embedded in the previous events, and this may cause the reduction of 143 the overall retention of the roof. To contrast this ambiguity in the event definition, some 144 manuscripts provide a detailed description of the procedure used for the data analysis 145 (climate, number of events, rainfall depth) and on top of that, they provide a definition of 146 events that take into account both precipitation and runoff (Carson et al., 2013; 147 Hakimdavar et al., 2014). In particular, for those authors a storm event begins when 148 rainfall is first recorded and ends when no precipitation or runoff has been recorded for 149 at least 6 hours.

That being said, it is clear how the absence of common standards, for collecting and analysing data, determines a significant difficulty in the comparison of experimental results coming from different research activities. To overcome this, in this study the methodology used for event definition and data analysis, followed the procedures used by Carson et al. (2013) and by Hakimdavar et al. (2014) to analyze the hydrological behaviour of some full-scale GRs in New York City (USA). The aim is to develop and follow common standards for data recording and analysis, allowing at the same time an easier and better comparison of the results.

158 **1.2** Overview of the hydrological models

159 In the last few years, researchers have proposed empirical relations between rainfall and 160 runoff based on field experiments (Carson et al., 2013; Fassman-Beck et al., 2013), event-161 based hydrological models (Bengtsson et al., 2005; Carbone et al., 2014; Jarrett et al., 162 2006; Kasmin et al., 2010; Lamera et al., 2014; Palla et al., 2012; She and Pang, 2010), 163 conceptual models for long term simulation (Locatelli et al., 2014; Stovin et al., 2013), 164 and numerical models by using commercial software such as HYDRUS (Hakimdavar et 165 al., 2014; Hilten et al., 2008; Palla et al., 2012), EPA's SWMM (Bonoli et al., 2013; 166 Burszta-Adamiak and Mrowiec, 2013; Krebs et al., 2014; Palla and Gnecco, 2015; Versini et al., 2015), MIKE URBAN (Locatelli et al., 2014), SWMS-2D and SWAP (see 167 168 Li and Babcock, (2014) and Elliott and Trowsdale (2007) for an overview). Among 169 several models used in GR studies, the gaps in model capabilities, in particular in long-170 term simulation, are continuously narrowed.

Li and Babcock (2014) underline that SWMM is a quick and valid assessment tool for quantifying the hydrological performance of a GR, which is also confirmed by the study of Palla and Gnecco (2015), who found that the LID (Low Impact Development) modules of SWMM, if correctly calibrated and validated (on an event basis, using events generated under controlled conditions in the laboratory), can be successfully implemented to study the hydrological response of a small urban catchment. On the contrary, Burszta-Adamiak 177 and Mrowiec (2013) observed that SWMM has limited capabilities in correctly 178 simulating the hydrograph of storm water runoff from a GR. However, simulations in 179 both studies were conducted for each analyzed event separately (single event 180 simulations), without taking into account the evapotranspiration (ET) process and the 181 restoration of retention capacity associated with it. On the contrary, as highlighted by 182 many authors (Berretta et al., 2014; Locatelli et al., 2014; Marasco et al., 2014; Poë et al., 183 2015; Stovin et al., 2012; Yang et al., 2014) ET is a keystone in long-term simulations, 184 because it is the hydrological process responsible for the movement of water to the air 185 from sources such as the substrate, the vegetation, and the drainage layer. Therefore, ET 186 restores the GR's water holding capacity increasing its retention capacity. In this 187 framework the present manuscript will provide a long-term simulation model that takes 188 into account the evaporation process as well.

189 1.3 Objectives

190 The first objective of this study is to present the hydrological monitoring results of a full-191 scale extensive commercial GR located in Bologna (Italy), with the intent of filling a gap 192 in knowledge of the stormwater retention performance of a full-scale commercial green 193 roof in a temperate sub-continental climate region.

The second goal of the study is to simulate the hydrological performance of GRs by means of SWMM using the LID control modules (version 5.1.010) using long-term rainfall and temperature data. For this purpose, a commercial extensive GR has been modelled using the "bio-retention cell" LID module and the model has been calibrated and validated based on the measurement results obtained from rainfall and runoff monitoring presented in the first part of the study.

200 2 METHODOLOGY

201 **2.1** Site description

A full-scale GR and an adjacent impervious roof area, both located above the LAGIRN
laboratory (44.513058°N, 11.318787°E) at the Engineering Campus of the University of
Bologna (UNIBO) have been used as case study.

The city of Bologna is located in northern Italy and has a humid temperate subcontinental climate with hot and muggy summers, cold winters, no dry season (Toreti et al., 2010) and an average precipitation of 700-800mm/year (Brunetti et al., 2006).

208 The experimental site (Bonoli et al., 2013; Maglionico et al., 2014) occupies about 120 209 m^2 of an existing flat roof, which was divided in two areas: one devoted to a newly added 210 extensive commercial GR (Sedum Roof, SR), while the other area was retrofitted with a 211 new membrane and was left bare as control plot (Reference Roof, RR) (Fig. 1). The SR 212 (5.15 m x 11.30 m), with a slope of 0.5 %, is a built-in-place system realized using a 213 commercial "green roof package" provided by Harpo Spa, Trieste, Italy, fully described 214 in other studies (Palla and Gnecco, 2015; Raimondo et al., 2015; Savi et al., 2013) (Fig. 215 1). Six layers were laid in sequence above the flat concrete roof, from bottom to top: a) 4 216 mm of waterproofing PVC root barrier membrane; b) 3 mm of protection fabric; c) 25 mm of drainage; d) 0.5 mm of filter fabric; e) 100 mm of substrate to support plant 217 218 growth; and f) a mix of Sedum vegetation (Fig. 1).

The GR plot is surrounded by a gravel strip (10 cm deep and 30 cm wide), placed above the layers (a-d), previously described, in place of the substrate (Fig. 1). The RR (5.15 m x 11.30 m), consists of a concrete flat roof insulated using a waterproofing PVC membrane (Fig. 1).



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Fig. 1. Aerial view of the experimental site showing: the extensive green roof (SR) and the reference roof (RR), the position of the in-pipe flow meters (W15 and W14 respectively for RR and SR), the position of the weather station and the stratigraphy of the green roof.

227 **2.2** Experimental setup and instrumentation

228 Each plot (SR and RR) has its own single, internal downspout (Fig. 1) and water cannot 229 migrate from one plot to the other. Runoff from both plots was measured using two in-230 pipe flow meters, W14 and W15 for the SR and RR respectively (Fig. 1), designed at 231 Columbia University (NYC) as those used in other studies (Carson et al., 2013; 232 Hakimdavar et al., 2014) and directly connected to a HOBO Onset weather station. The 233 aforementioned flow meters consist of a runoff chamber with an outlet weir and a Senix 234 TSPC-30S1 ultrasonic sensor. The ultrasonic sensor detects the rise in water height and 235 adjusts its output voltage accordingly. The voltage reading can then be related to a water 236 flow rate by a calibration equation, to determine the runoff depth. The flow meters, the 237 operating procedure and data transmission to the HOBO logger system is fully described 238 in the study written by Carson et al. (2013). The Onset HOBO U30 weather station 239 installed on site, above the GR plot, as showed in Fig. 1, records: rainfall, wind speed,

gust speed, wind direction, relative humidity, atmospheric temperature, dew point, solar radiation and photosynthetically active radiation (PAR) at 5-minute intervals. Since May 2014, a Decagon's ECH2O sensor directly connected to the weather station, has monitored the volumetric water content of the soil by measuring the dielectric constant of the soil, which is a strong function of water content. Together with the sensor's data, this information is sent to a Wi-Fi data logger and an online platform, from which they can be easily accessed.

247 Single runoff events were defined following the procedure illustrated by other studies 248 (Carson et al., 2013; Hakimdavar et al., 2014; Nawaz et al., 2015; Vanwoert et al., 2005): 249 a storm event begins when rainfall is first recorded, with a minimum rain gauge sensitivity 250 of 0.2 mm, and ends when no precipitation or runoff has been recorded for 6 hours. 251 Afterwards, storm events were considered unsuitable for analysis and were discarded if 252 they followed any of these unacceptability conditions: 1) the recorded peak runoff rate 253 caused the depth of water behind the weir device face to exceed 90% of the notch height 254 (in fact when flow rates exceed this amount, the turbulence within the runoff chamber 255 could cause unreliable readings); 2) precipitation was in the form of snow; 3) the 256 cumulative runoff exceeded total rainfall, and 4) the ultrasonic sensor lost power over the 257 course of the storm event (see Carson et al. (2013) for more details).

Laboratory tests were performed to measure the physical properties and the water retention characteristics of the substrate. Tests included: particle size distribution, bulk density, particle density, porosity, water retention and hydraulic conductivity. Moisture release curves were determined using a WP4-T dew point meter (Decagon Devices, Pullman, WA) following the procedure illustrated by Bittelli and Flury (2009). To determine soil water fluxes in unsaturated soils, a common approach is to numerically solve the Richards equation, which generally requires the parametrization of the soil water retention curve (Bittelli and Flury, 2009; Campbell, 1985). The physical characteristics of the substrate and the parameters, obtained from the fitting with the modified van Genuchten-Mualenm model (Ippisch et al., 2006) of the water retention curve, are listed in Table 2, and the corresponding curves are shown in Fig. 2.

Fig. 2a shows the soil water retention curve, used to determine the Field Capacity (FC) at 0.01 bar suction and the permanent Wilting Point (WP) at 15 bar suction (as provided by the Italian standard (UNI EN 13041, 2012); while Fig. 2b shows the hydraulic conductivity curve used to obtain the saturated hydraulic conductivity (Ks).



Fig. 2. Soil water retention curve (a) and hydraulic conductivity (b) for the 10 cm deep substrate (FC,
 field capacity at 0.01 bar suction; WP, wilting point at 15 bar suction; and Ks, saturated hydraulic
 conductivity).

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| Parameter | System Unit | Substrate |
|----------------------------|-------------------|-----------|
| D50 | mm | 6 |
| Particle density, ρ_p | g/cm ³ | 2.70 |
| Dry density, ρ_{dry} | g/cm^3 | 0.90 |
| Porosity, n | % | 62 % |
| Field capacity | m^{3}/m^{3} | 0.35 |
| Wilting point | m^{3}/m^{3} | 0.06 |
| Organic content | % | <4 |

279 **2.3** Climate analysis

The average rainfall in the city of Bologna fluctuates from around 400 mm to 1,000 mm a year. Most of the rainfall events usually occur in spring and fall. Although snow events are not uncommon, there was no snow during this case study monitoring period.



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284 Fig. 3. Boxplot of the historical rainfall recorded over 26 years (1990-2015) for the city of Bologna. The 285 bottom and the top of the box are the first and third quartiles, and the band inside the box is the second 286 quartile (the median). The ends of the whiskers represent the lowest and the highest datum. Any data not 287 included between the whiskers have been plotted as outliers. The blue trend line (square indicators) 288 indicates the case study monthly rainfall depths for the monitoring period (from Jan/2014 to Dec/2014). 289 The climatic conditions gathered from the case study HOBO weather station over 12 290 months (January 2014 – December 2014) where compared to the historical data provided 291 by the Regional Agency for Prevention, Environment and Energy in the Emilia-Romagna 292 region, Italy (ARPAE, 2016). The variation of monthly rainfall, over 26 years (1990-293 2015), is shown in Fig.3 through the use of a box-plot for each month of the year, while 294 the blue trend line (square indicators) shows the total monthly rainfall during the 295 monitoring period. Overall, the rainfall data during the study period are consistent with

the historical rainfall data. The cumulated monthly rainfall is above its average historical value for eight months out of 12, in particular summer 2014 was very rainy. During the months of June, July and September the rainfall was far above the median, while in August it was slightly below the median of the historical data.

300 3 EPA SWMM MODEL

301 3.1 Presentation of EPA SWMM

302 The EPA Storm Water Management Model (SWMM, version 5.1.010) was selected as

303 the modelling platform for studying the hydrologic response of both the green roof and

304 the conventional plot. SWMM is a dynamic hydrology-hydraulic and water quality

305 simulation model that was primarily developed for urban areas allowing short and long-

term simulations (Rossman, 2015, 2010).

307 LID control modules that provide detention storage, enhanced infiltration and 308 evapotranspiration of runoff from localized surrounding areas (e.g. rain garden, bio-309 retention cell, permeable pavement, infiltration trench, etc.) have been implemented in 310 SWMM to simulate the hydrological behaviour of such source control technologies since 311 2005 (Palla and Gnecco, 2015; Rossman, 2015; Versini et al., 2015). LID controls are 312 represented by a combination of vertical layers whose properties (such as: thickness of 313 the different layers, physical properties of the materials, and underdrain characteristics) 314 are defined on a per-unit-area basis (Qin et al., 2013). This allows LIDs which differ in 315 areal coverage only, and not in design, to be easily placed within different subcatchments 316 in a study area (Palla and Gnecco, 2015).

317 To take into account the impact of climate data on the LID retention performance and 318 compute the potential daily evapotranspiration, SWMM offers a climatology editor

function with a single set of time-dependent temperatures applied throughout the study
area (Rossman, 2015). Maximum and minimum daily temperatures and the study area's
latitude are used by the software to compute the potential evapotranspiration applying the
Hargraves method (Hargreaves and Samani, 1985), fully illustrated by Rossman (2016,
2015).

324 **3.2** M

Modelling the green roof plot using the SWMM LID modules

325 Starting from version 5.1 (2014), the SWMM software is equipped with an additional 326 LID module for GR modelling, "Green Roof" LID Type (GR-LID), which is a variation 327 of a "Bio-Retention Cell" LID Type (BRC-LID). Generally, LID Controls are defined 328 and assigned to subcatchments through a series of three different editor forms: i) The LID 329 Control Editor, ii) the LID Group Editor and, iii) LID Usage Editor.

330 The LID Control editor is used to define a low impact development control that can be 331 deployed throughout a study area to store, infiltrate, and evaporate subcatchment runoff 332 (such as: bio-retention cell, rain garden, green roof, infiltration trench, permeable 333 pavement, rain barrel, or vegetative swale). The LID Group Editor is used to add any type 334 of LID controls to a specific subcatchment. Finally, the LID Usage Editor is used to 335 describe how each LID control added to a LID group is deployed within the group's 336 subcatchment. It is nested under the LID Group Editor to be able to specify the areal 337 extent of the control, the portion of the subcatchment's runoff that it treats, and for some 338 LID the "% Initially saturated" which define the degree to which the unit's soil is initially 339 filled with water.

A GR-LID is composed of three layers: surface (vegetation), soil (substrate), and drainage
material, while the BRC-LID differs because of the presence of two layers (storage and

drain) instead of the drainage material only. The main difference between these LID types
is that in the GR-LID the drain system is design-based, while in the BRC-LID it is
performance-based (Rossman, 2016).

345 Palla and Gnecco (2015) demonstrate that a GR-LID can be successfully used for 346 modelling the hydrological behavior of a GR, by using the property of the soil as 347 calibration parameters and by fixing, as initial condition, the soil moisture content of the 348 LID before each simulated event ("% Initially saturated" parameter). However, when the 349 geometry of the drainage material is not standard, when all the physical properties of the 350 layers are measured in laboratory, and last but not least when the degree of saturation of 351 the LID before each storm event is automatically calculated by the model, as in a long-352 term simulation, the only way to regulate the outflow is the calibration of two parameters 353 of the drain layer of a BRC-LID called "Drain coefficient" and "Drain exponent". 354 Through these two parameters the software determines the flow rate through the drain 355 itself (Rossman and Huber, 2016).

Based on the above considerations, in the present study the full-scale GR has been
modelled by coupling two LID modules: i) a bio-retention cell for the GR system, and ii)
a porous pavement for the gravel strip, both LID modules fully occupy the respective
subcatchment.

As recommended by several authors (Alfredo et al., 2010; Burszta-Adamiak and Mrowiec, 2013; Mrowiec et al., 2014; Zhang and Guo, 2014), the SWMM LID model (SR surface) and the SWMM model (RR surface) have been calibrated and validated based on the experimental monitoring data.



Fig. 4. Data acquisition during year 2014: cumulative daily rainfall (mm) (top), average hourly air
 temperature (°C) and dew point (°C) (bottom).

367 **3.3 Input data**

364

The rainfall and air temperature recorded by the on-site HOBO weather station in 2014, were used as input data to calibrate and validate the model. Fig. 4 shows the daily distribution of rainfall and the hourly average air temperature over year 2014.

371 In order to simulate the evapotranspiration process in a GR which is responsible for 372 decreasing the substrate moisture content and thus for restoring the retention capacity of 373 a GR (Berretta et al., 2014), the climatology editor of SWMM was set up. The software 374 automatically applies an empirical formula (Hargreaves and Samani, 1985) for estimating 375 potential daily evapotranspiration (ET₀) that depends on daily air temperature and solar 376 radiation at the study site. However, potential evapotranspiration (ET₀) differs from real 377 evapotranspiration (ET_r) because the first is related to a reference crop, which can be 378 either grass or alfalfa (Hargreaves et al., 1985), and is affected only by climatic

379 parameters, while the second is influenced by the type of plants, crop characteristics and 380 cultivation practices (Allen et al., 1998). In the case of GRs, the real evapotranspiration 381 may deviate from ET₀ due to the use of a non-standard plant (sedum) and of non-optimal 382 conditions, such as low soil fertility, water shortage or waterlogging. To take into account 383 this, in the present study the Hargreaves equation was adapted to the SR case specifying 384 a monthly soil recovery pattern (Table 3), whose factors, multiplied by ET₀, transform ET₀ in ET_r and then adjust the rate at which infiltration capacity is recovered during 385 386 periods with no precipitation.

| Month | Value |
|-----------|-------|
| January | 0.05 |
| February | 0.05 |
| March | 0.15 |
| April | 0.60 |
| May | 1.00 |
| June | 1.15 |
| July | 1.15 |
| August | 1.15 |
| September | 0.30 |
| October | 0.20 |
| November | 0.15 |
| December | 0.05 |

387

 Table 3: Monthly soil recovery pattern.

These coefficients were found through a procedure which takes into consideration, in similitude with the study done by Berretta et al. (2014), the experimental measurements of the substrate moisture content during dry periods and the comparison with simulated moisture content using a hydrologic model based on water balance and on the Hargreaves ET_0 model. Altogether, these coefficients incorporate mainly crop characteristics and averaged effects of evaporation from the soil over the length of the growing season (Cipolla, 2015).

395 **3.4** Calibration and validation procedures

396 Model calibration and validation is based on the comparison of the observed and modeled 397 runoff flow rates. In order to assess the model performance on an event basis, the RMSE-398 Observation Standard Deviation Ratio (RSR) was calculated. The RSR is the ratio of the 399 root mean square error (RMSE) to the standard deviation of measured data, and varies 400 from the optimal value of 0, to a large positive value (Moriasi et al., 2007). Lower values 401 of RSR correspond to lower RMSE values and to a better model simulation performance. 402 Furthermore, the Nash–Sutcliffe Efficiency index (NSE) was evaluated to quantitatively 403 assess the model accuracy in reproducing the runoff flow rate on an event basis (Nash 404 and Sutcliffe, 1970).

405 4 RESULTS AND DISCUSSION

406 4.1 Hydrological Experimental Observations

407 Rainfall and runoff were continuously collected from 01/01/2014 to 31/12/2014 for the
408 SR plot, whereas only from 01/01/2014 to 31/05/2014 for the RR.

409 The monitoring campaign resulted in 69 and 23 valid runoff measurements, from the 410 original 122 storm events recorded, respectively for the SR and RR. Unfortunately, after 411 3 months of data collection, the W15 flow meter had a malfunction which temporary 412 interrupted the recording of runoff data, thus a statistical analysis of those data will not 413 be presented.

The measured rainfall depth of the 69 storm events, that generated a valid runoff measurement for SR, ranged from 0.2 to 41.6 mm, while the normalised runoff varied from 0 to 33.1 mm. Rainfall attenuation of individual events ranged widely from 6.4% to 417 100%. The total number of storm events that generated zero runoff was 34 out of which 418 19 had a rainfall depth higher than 0.2 mm; the largest event with 100% retention was 7.8 419 mm (26/03/2014). During the monitoring period the SR has demonstrated a retention 420 capacity of 51.9% of the total rainfall volume from suitable events. This may be compared 421 to the previously-published annual retention data for similar GRs (Table 1). From a range 422 of studies, including only full-scale installation with 10 cm of substrate depth, the 423 retention capacity ranged between 12% and 74% (Berkompas et al., 2008; Carson et al., 424 2013; Hutchinson et al., 2003; Liu and Minor, 2005; Moran et al., 2005; Spolek, 2008). 425 The performance of the Bologna full-scale GR falls slightly above the average value 426 (46.7%) of previously reported data (Table 1).

427 **4.2** Calibration and validation results

The experimental site was simplified in 3 subcatchments: two for simulating the SR plotand one for the RR, 4 junctions, 2 outfalls, and 4 conduits.

430 The model was calibrated over 6 events (2 for the RR and 4 for the SR), reported in Table

431 4, and was verified by simulating a complete 1 year (2014) data period and then validated
432 with 6 rain events (2 for the RR and 4 for the SR) spread out along the year.

The experimental rainfall time series were analyzed against Bologna historical records obtained from the Regional Agency for Prevention, Environment and Energy in the Emilia-Romagna region, Italy (ARPAE, 2016). Fig. 5 compares all the 69 monitored events (SR plot) in terms of total rainfall depth and duration (red hollow circles) to the relevant Intensity-Duration-Frequency (IDF) curves taking into account the event return periods found using the historical data. The majority of the events fall below the 2 year return period threshold, as happened in other similar studies (Stovin et al., 2012), with 4 events with a return period bigger than 2 years. The rainfall record contains a reasonable
distribution of short and long-duration events. The black and grey indicators in Fig. 5,
show the events used for calibration and validation for the SR and RR model respectively.



Fig. 5. Rainfall characteristics for the 12 month data series compared with the IDF return period curves
estimated for Bologna. The black and grey full indicators show the events used for calibration and
validation for the SR and RR model respectively.

447 For the events chosen for calibration and validation the rainfall characteristics are
448 summarized in table 4 in terms of rain duration, rainfall depth, peak intensity and return
449 period.

The 12 storms vary widely (Table 4), ranging in duration from 65 minutes to almost 37 hours and in depth from 2.6 to 44.4 mm. Pursuing the purpose of observing the behaviour of the model under different weather conditions, the calibration/validation events have been chosen in different seasons of the year and with a wide range of rainfall intensity and return period.

455

| | ate yy] | $\Xi = \frac{\Xi}{\Xi} \approx -$ Return period (ye | | | ц П | | Return period | | E Return period (year) | | | | |
|------|--------------------------|---|--------------------------|--------------------------------|-------|-------|---------------|-----|------------------------|------|--|--|--|
| Plot | Events D [dd/mm/. | Rain Duratio [min] | Rainfal depth [mm] | Peak 5-n Intensit [mm/h] | Event | 0.5 h | 1 h | 3 h | 6 h | 12 h | | | |
| RR | 19/02/14 ^C | 1282 | 11.6 | 16.8 | <2 | <2 | <2 | <2 | <2 | <2 | | | |
| | 04/03/14 | 1140 | 44.4 | 9.6 | <2 | <2 | <2 | <2 | <2 | <2 | | | |
| | 04/04/14 ^C | 860 | 30.8 | 38.4 | <2 | <2 | <2 | <2 | <2 | <2 | | | |
| | 26/05/14 | 440 | 24.8 | 88.8 | <2 | <2 | <2 | <2 | <2 | | | | |
| SR | 10-12/02/14 ^C | 1300 | 16.6 | 9.6 | <2 | <2 | <2 | <2 | <2 | <2 | | | |
| | 22/04/14 | 65 | 2.6 | 12.0 | <2 | <2 | <2 | <2 | <2 | | | | |
| | 14/06/14 ^C | 140 | 41.6 | 168.0 | 6 | 48 | 14 | 5 | | | | | |
| | 11/09/14 | 165 | 39.8 | 48.0 | 4 | <2 | 4 | 4.5 | | | | | |
| | 20/09/14 ^C | 240 | 39 | 69.6 | 4 | 3 | 3 | 4 | 2 | | | | |
| | 10-11/11/14 | 1285 | 11.6 | 9.6 | <2 | <2 | <2 | <2 | <2 | <2 | | | |
| | 17-18/11/14 ^C | 2270 | 12 | 4.8 | <2 | <2 | <2 | <2 | <2 | <2 | | | |
| | 03/12/14 | 425 | 1 | 2.4 | <2 | <2 | <2 | <2 | <2 | | | | |

Table 4. Rainfall characteristics for the calibration/validation rainfall events. The superscript 'C' denotes

the calibration events.



459 Fig. 6. Rainfall hyetographs and the corresponding measured runoff (grey area) compared to the460 simulated runoff (black line) for RR during 2 events used for calibration and 2 validation events. The

| 461 | events correspond to: a) February 19th, 2014, b) March 4th, 2014 c) April 4th, 2014 d) May 26th, 2014. The |
|-----|--|
| 462 | superscript 'C' denotes the calibration events. |

463 **4.2.1 The RR surface model**

The RR model is calibrated and validated based on 4 events, measured by the on-site W15 flow meter and collected between February and May 2014; the February 19th, 2014 and the April 4th, 2014 events were selected for the calibration phase. The rainfall intensity, the observed and the modeled flow rates for the selected calibration and validation events are shown in Fig. 6. While the calibrated SWMM parameters (Depression depth, N Manning and % Zero-Imperv) are reported in Table 5.

| SWMM Parameter | SU | Values |
|------------------|----|--------|
| Depression depth | mm | 1 |
| N Manning | - | 0.011 |
| % Zero-Imperv | % | 5 |

470

Table 5. Parameters assigned in the SWMM RR model.

471 Fig. 6a and Fig. 6c show the rainfall hyetograph and the corresponding simulated and 472 observed runoff for the two calibration events. The model reproduces with good matching 473 capabilities the complex-shape (multi-peaks) outflow regime for both low (< 20 mm/h) 474 and average (< 40 mm/h) rainfall intensities. The model is able to accurately reproduce 475 the timing and the magnitude of the peak flow rate. NSE values (see Table 6) are greater 476 than 0.7 confirming the suitability of the model to describe the hydrologic response of a 477 traditional impervious roof, while the low value of RSR (0.36) indicates a good model 478 performance. Fig. 6b and Fig 6d show the rainfall hyetograph and the corresponding 479 simulated and observed runoff for the validation events. The model provides a good 480 description of the runoff response (Fig.6b and Fig. 6d) both in terms of shape and peak 481 of the outflow hydrograph. NSE and RSR values (see Table 6) are good for the 482 26/05/2014 event while the performance of the model decrease for the 04/03/2014.

| Plot | Events | NSE | RSR |
|------|--------------------------|------|------|
| | Date (dd/mm/yy) | (-) | (-) |
| RR | 19/02/14 ^C | 0.87 | 0.36 |
| | 04/03/14 | 0.41 | 0.77 |
| | 04/04/14 ^C | 0.72 | 0.36 |
| | 26/05/14 | 0.85 | 0.35 |
| SR | 10-12/02/14 ^C | 0.58 | 0.65 |
| | 22/04/14 | 0.60 | 0.63 |
| | 14/06/14 ^C | 0.66 | 0.59 |
| | 11/09/14 | 0.85 | 0.39 |
| | 20/09/14 ^C | 0.93 | 0.27 |
| | 10-11/11/14 | 0.44 | 0.75 |
| | 17-18/11/14 ^C | 0.61 | 0.62 |
| | 03/12/14 | 0.76 | 0.49 |

Table 6: Nash–Sutcliffe Efficiency (NSE) index and Observation Standard Deviation ratio (RSR) of the
total effluent volume for the observed rainfall events used for the calibration and validation. The
superscript 'C' denotes the calibration events.

486 4.2.2 The SR green roof model

The SR numerical model is developed by coupling two LID modules, as explained in section 3.2. The model is calibrated based on experimental rainfall/runoff data collected in 2014 for the full-scale SR. Table 7 shows the parameters required by the bio-retention cell and the permeable pavement LID control modules. The SR model is calibrated and validated based on 8 events measured by the W14 flow meter and collected between February and December 2014 (Table 4 and Table 6).

Burszta-Adamiak and Mrowiec (2013) affirm that the main parameter influencing the simulation results of a LID is called "% Initially saturated" (specified in LID Usage Editor). For each LID type this parameter expresses the degree to which the unit's substrate is initially filled with water (0% saturation corresponds to the wilting-point moisture content, 100% saturation has the moisture content equal to the porosity). Also Palla and Gnecco (2015) recognize the importance of this parameter by doing a sensitivity analysis to understand how the uncertainty in the outflow (such as volume, peak and 500 shape) can be apportioned to different sources of uncertainty compared to the initial 501 moisture content value. Pursuing the goal of reducing the dependence of the model on 502 this parameter, its value was set equal to 100%, as initial condition. This means that it is 503 the model itself that, as a function of the weather data and of the ET rate, estimates the 504 degree of saturation of LIDs before a rainfall event. This assumption generates a runoff 505 rate during the first day (01/01/2014) of the long-term simulation, which disappears from 506 the second day forward. Furthermore, during the second day of simulation (02/01/2014)507 the substrate moisture content in the model has a value equal to the field capacity (0.35 508 v/v), which is coherent with the results of on field moisture content measurements made 509 in January 2014 and 2015 by the authors.

| Layer | Parameter | SU | Bio- retention Cells | Permeabl e Pavement |
|----------|----------------------------------|---------------|----------------------------|---------------------------|
| Surface | Berm Height Vegetation Volume | mm | 3 | 3 |
| | Fraction | | 0.15 | 0 |
| | Surface Roughness | $m^{1/3}/s$ | 0.2 | 0.02 |
| | Surface Slope | % | 0.5 | 0.5 |
| Pavement | Thickness | mm | - | 100 |
| | Void Ratio | | - | 0.4 |
| | Impervious Surface Fraction | | - | 0 |
| | Permeability | mm/h | - | 3000 |
| | Clogging Factor | | - | 0 |
| Soil | Thickness | mm | 100 | - |
| | Porosity | % | 0.65 | - |
| | Field Capacity | m^{3}/m^{3} | 0.35 | - |
| | Wilting Point | m^{3}/m^{3} | 0.06 | - |
| | Conductivity | mm/h | 160 | - |
| | Conductivity Slope | | 5 | - |
| | Suction Head | mm | 25 | - |
| Storage | Thickness | mm | 25 | 25 |
| | Void Ratio | | 0.5 | 0.5 |
| | Seepage Rate | mm/h | 0 | 0 |
| | Clogging Factor | | 0 | 0 |

| Underdrain | Drain Coefficient | | 2 | 0.15 |
|------------|-------------------|----|-----|------|
| | Drain Exponent | | 2.1 | 1.6 |
| | Offset Height | mm | 3 | 3 |

510 **Table 7:** Parameters assigned in the SWMM model-LID control section for the GR (modelled as a bio-

511 retention cell) and for the gravel stripe (modelled as a permeable pavement).



512

Fig. 7: The rainfall hyetographs and the corresponding measured runoff (grey area) compared to the
simulated runoff (black line) for SR during 4 events used for calibration. The events correspond to: a)
February 10th, 2014; b) November 17th, 2014; c) June 14th, 2014 and d) September 20th, 2014.

The hyetographs, the corresponding measured and simulated hydrographs for the four calibration events are illustrated in Fig. 7, while the NSE and the RSR index for both calibration and validation events are reported in Table 6. During the calibration phase the SR model showed a good ability in reproducing the complex-shape outflow, in particular the magnitude and the timing of the peak flow rate were accurately predicted in all the seasons (Fig. 7), as confirmed by NSE values >0.58 and RSR <0.65. Results of the validation procedure confirm the suitability of the model in reproducing the outflow: not
only the mean NSE value is 0.66 (standard deviation 0.032) for the four validation events,
but also the average RSR is 0.56 (standard deviation 0.025); those values clearly reveal
the model accuracy in predicting the outflow of the full-scale GR.

526 4.3 Long term simulation in SWMM

527 Once the RR and SR models were calibrated and validated on experimental measurements 528 of rainfall and relative runoff, a one-year simulation was launched. Summarizing from 529 above, the input data were: the rainfall data with a 5-minute time step, the maximum and 530 minimum daily temperatures, the latitude of the site, and a set of monthly soil recovering 531 coefficients (Table 3). In addition, the LID modules were considered fully saturated, as 532 initial condition.

533 Predicted cumulative runoff at the SR plot is in good agreement with the experimental 534 measurements. The cumulative outflow volume of the 69 measured events, was in fact 535 only 9% lower than the discharge volume obtained through the SWMM modeling, which 536 proves the ability of the model in predicting the overall hydrological process. Fig. 8 shows 537 that in winter (Jan-Mar 2014), the difference between the runoff from RR and SR is 538 minimal. This is certainly due to the fact that the substrate moisture content never drops 539 below the field capacity. The cumulative annual water balance is displayed in Fig. 8 for 540 the SR and RR plots respectively. The simulated cumulative runoff volumes were 48.1 541 m³ and 27.7 m³, respectively for RR and SR, and correspond to an annual retention of 542 11% and 48%. The cumulative retention results demonstrate that the SR, despite having 543 only 10 cm of substrate depth, can make a significant contribution in reducing the total 544 volume of stormwater that might otherwise impact watercourses, require treatment or



546

547 Fig. 8. Storm events (blue line), cumulative rainfall (black line) and cumulative simulated runoff from the
548 conventional RR (gray line) and the green roof SR (green line).

549 **5 CONCLUSION**

GRs are becoming one of the key technologies for achieving a sustainable urban drainage system; however, their level of performance is very site specific because of the impact of the layer materials, vegetation, physical properties of the substrate, design specification and climate conditions. Furthermore, the hydrological performance of a GR is strongly influenced by the size of the studied plots (full-scale vs small scale), the definition of "event", and the number of events included in the study (Carson et al., 2013).

Experimental studies have the ability to narrow the gap between hydrological model
simulations and reality, especially if performed on full-scale green roofs with the support
of field data monitoring.

559 Given the above, this study first provided an accurate review of the scientific literature,

560 with a focus on experimental studies on full-scale installation. Previous studies found that

the annual retention volume can range from 11.0 % to 76.4 % with an average retention

value of 46.7% (Table 1). In addition, the study provided a synthetic literature review
about hydrological models in this field, which also underlined the difficulty of complete
numerical models in long terms simulations.

The second part of the study was devoted to the description of the experimental site and instrumentation. The results of the monitoring campaign performed from January 2014 to December 2014 were later used to calculate the experimental green roof's (SR) annual average retention, found to be 51.9 %. This value falls in the average range of the values indicated by previous studies (Table 1).

570 Finally, the study described a numerical model realized by means of SWMM 5.1, which 571 was calibrated and validated using field measurements and then used to simulate the long 572 term hydrologic response of two adjacent experimental surfaces of the same size: an 573 impervious and a green full-scale roof. Modelling results confirmed the role of GRs in 574 restoring the natural regime reducing the annual runoff volume. The comparison of the 575 results obtained for the experimental green roof SR to the SWMM simulation results 576 proved that the suggested model has good capabilities in correctly simulating the 577 hydrograph of storm water runoff from GRs along the year. This is confirmed by the quite 578 high values of NSE and the low values of RSR obtained in both the calibration and 579 validation phases. Furthermore, the low difference (< 9%) in total retention between the 580 69 measured and simulated events confirms the suitability of the model for long-term 581 simulations.

The proposed modelling approach demonstrated that SWMM can be suitably used for assessing the continuous LID performance, and consequently for supporting local authorities or designers in the evaluation of the hydrological efficiency of green roofs.

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