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Centro Euro-Mediterraneo  
sui Cambiamenti Climatici



ALMA MATER STUDIORUM  
UNIVERSITÀ DI BOLOGNA

# Safer\_RAIN: a DEM-based hierarchical filling-&-spilling algorithm for pluvial flood hazard assessment in urban areas

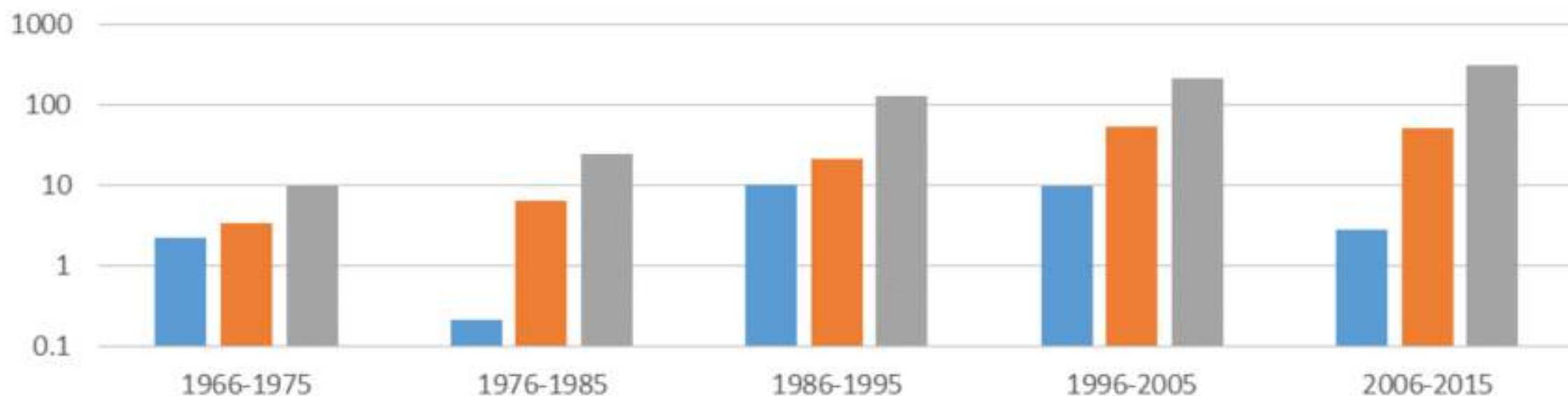
Simone Persiano<sup>1</sup>, Caterina Samela<sup>1,2</sup>, Valerio Luzzi<sup>3</sup>,  
Ricardo Tavares da Costa<sup>1,3</sup>, Paolo Mazzoli<sup>3</sup>, Jaroslav  
Mysiak<sup>4</sup>, Stefano Bagli<sup>3</sup>, Attilio Castellarin<sup>1</sup>

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**Presenting author: Attilio Castellarin**

# Flood Losses: Italian, European and Global Scale

Billions of 2016 US Dollars



**EM-DAT**  
The International Disaster Database  
Centre for Research on the Epidemiology of Disasters - CRED

Search...

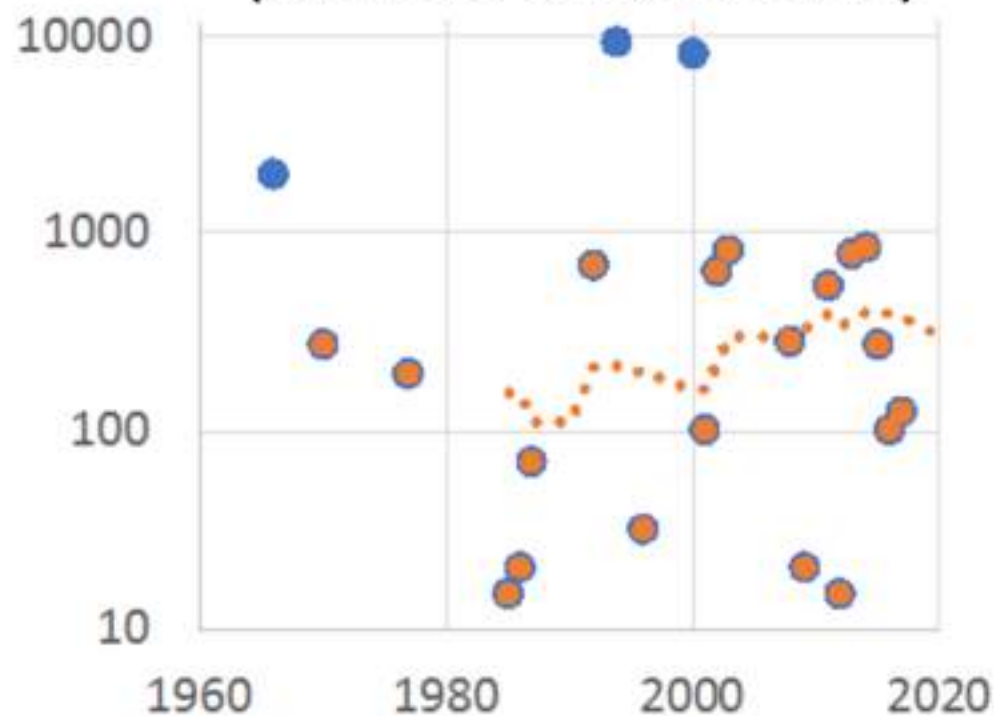
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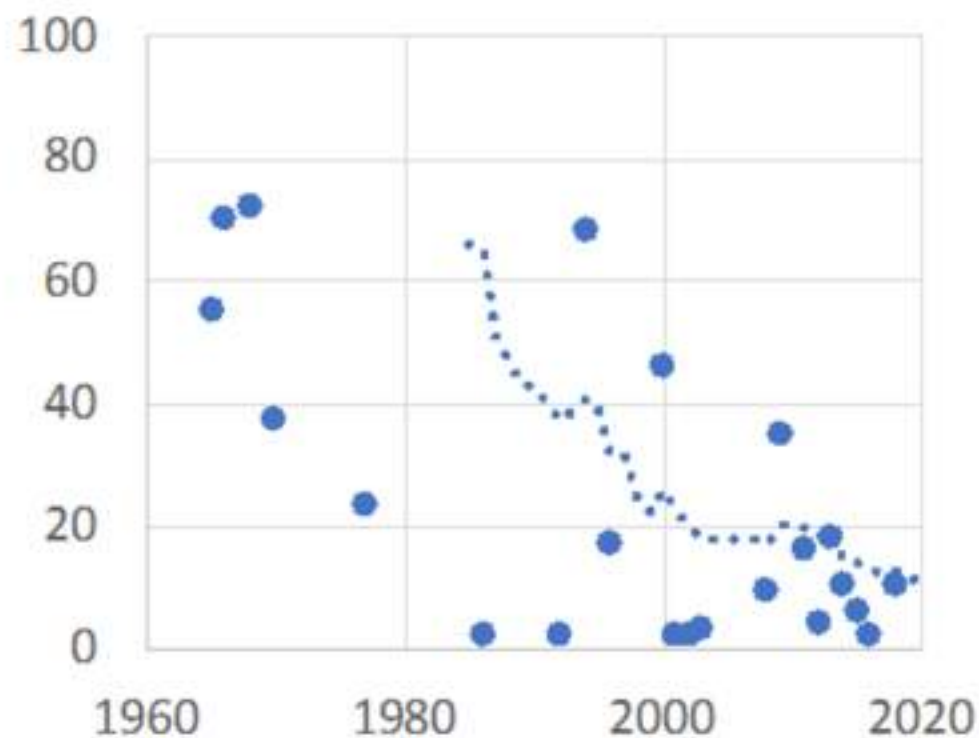
Data source: <http://www.emdat.be/>

# Italy: flood losses and victims

## Economic losses (Millions of 2019 USD)



## Life losses



# 'Floods Directive' – Directive 2007/60/CE

D.Lgs. N. 49 del 23/2/2010

Directive 2007/60/CE or «Floods Directive» aims at harmonizing flood hazard and risk assessment and management across European Member States.

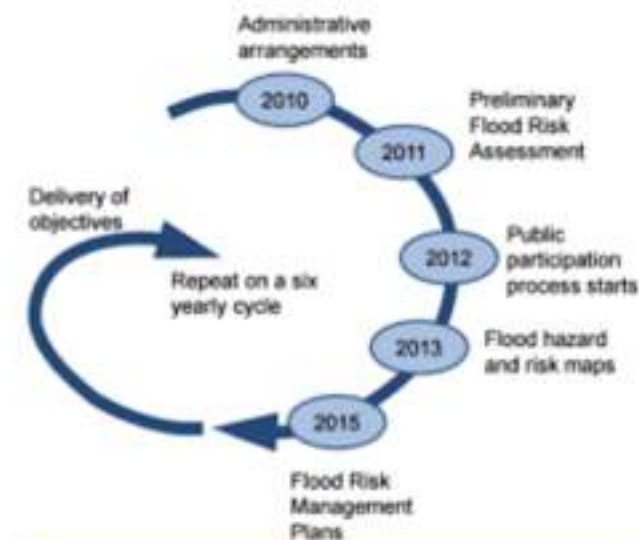
## Objective:

Its aim is to reduce and manage the risks that floods pose to human health, the environment, cultural heritage and economic activity.

The Directive requires Member States to **carry out a preliminary assessment, to identify the river basins and associated coastal areas at risk of flooding**. For such zones they would then need to **draw up flood risk maps** and **establish flood risk management plans focused on prevention, protection and preparedness**. The Directive applies to **inland waters as well as all coastal waters** across the whole territory of the EU.

<http://eur-lex.europa.eu/LexUriServ/LexUriServ.do?uri=OJ:L:2007:288:0027:0034:IT:PDF>  
[http://www.isprambiente.gov.it/pre\\_meteo/file/DLGS\\_49\\_2010\\_agg2014.pdf](http://www.isprambiente.gov.it/pre_meteo/file/DLGS_49_2010_agg2014.pdf)

## Directive 2007/60/CE: Planning Cycle



Chapter VIII: reviews,  
reports and final  
provisions



# 'Floods Directive' – Directive 2007/60/CE

## D.Lgs. N. 49 del 23/2/2010

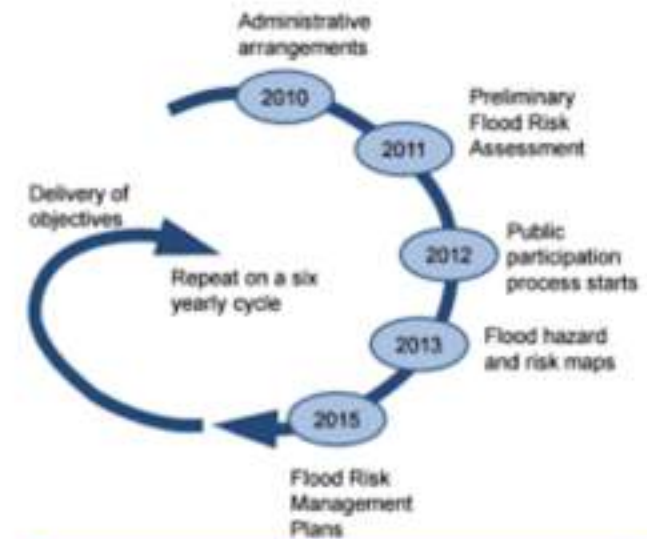
### (Research) Challenges from the Floods Directive

1. Large Scale Assessment  
(Nation-wide, pan-European)
2. Holistic Approach  
(Solidarity principle)
3. Objective and Quantitative  
(Risk quantification)
4. Dynamic Interpretation  
(6-year review cycle)

Systems approach to  
flood risk assessment  
and mitigation

Floods Directive  
poses science  
questions that need  
to be addressed by  
ad-hoc research  
activities

### Directive 2007/60/CE: Planning Cycle



Chapter VIII: reviews,  
reports and final  
provisions



# Numerical modelling and Flood Hazard and Risk Assessment

Numerical two-dimensional inundation models:

- Wealth of hydraulic information
- Resource intensive & Scale of the application is limited by the resolution of the output



**FLUVIAL**  
(Secchia River)

TELEMAC-2D - Two-dimensional hydrodynamic model  
<http://www.opentelemac.org> (Free and Open Source SW)



**PLUVIAL**  
(Lignano UD)

Hydro\_AS-2D - Two-dimensional rainfall-runoff and hydrodynamic model



# SAFERPLACES

Improved assessment of pluvial, fluvial and coastal flood hazards and risks in European cities as a means for building safer and more resilient communities



Climate-KIC



## SAFERPLACES' CONSORTIUM

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**POLITÉCNICA**

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**MEEO**  
Meteorological Environmental  
Earth Observation



Climate-Kic  
Flagship Initiative

**OASIS** HUB

# SAFERPLACES



Climate-KIC

Improved assessment of pluvial, fluvial and coastal flood hazards and risks in European cities as a means for building safer and more resilient communities



## SAFERPLACES' MAIN OBJECTIVE CONCERNING FLOOD HAZARD CHARACTERIZATION:

To assess the potential of **fast-processing DEM-based algorithms** for **consistent flood hazard characterization** at local scale, and their viability for upscaling and generalizing the assessment to larger areas (e.g. large floodplains, large metropolitan areas and regional assessments)

Considered hazard sources: **Fluvial, Pluvial, Coastal Flooding**

### Today's focus:

**Fluvial-flooding** across large floodplains

**Pluvial-flooding** in urban areas



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Hashtag: #SAFERPLACES\_CKIC



# Why Pluvial Flooding in Urban Areas?

Particularly severe storms, with limited duration and highly localized can trigger «*urban flash-floods*»



Italian press launched the term «*water bomb*» to identify a classical phenomenon in Italy: «*nubifragio*», «*cloudburst*» in English, a violent and short rainstorm resulting in a cumulated rainfall depth **in excess of 30mm in 1 hour.**

**Livorno, Sept. 9-10, 2017**  
Rainfall depth at Valle Benedetta: 235 mm in 3 hrs.

**Lignano (Udine), Sept. 10-12 2017**  
Rainfall depth: 280 mm, of which 120 mm in 4 hrs., 55 mm in 1 hr.

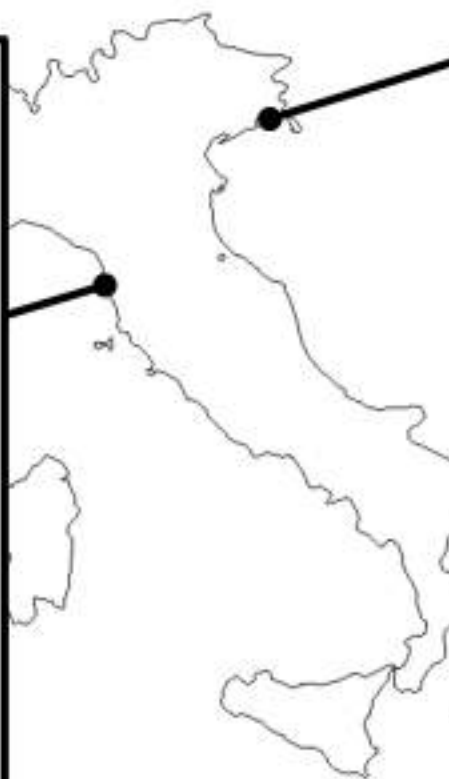
# Why Pluvial Flooding in Urban Areas?

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**Livorno, Sept. 9-10, 2017**  
Rainfall depth at Valle Benedetta: 235 mm in 3 hrs.



Relative to fluvial flooding:

- **Localized damages, yet**
- **Higher frequency**



**Non-negligible  
Expected  
yearly losses**

Rainfall depth: 280 mm, of which 120 mm in 4 hrs., 55 mm in 1 hr.

# 1<sup>st</sup> part: Fluvial Flooding

## **SAFERPLACES research goal:**

Developing a **fast-processing DEM-based GIS algorithms** for characterizing fluvial-flooding hazard across large floodplain areas

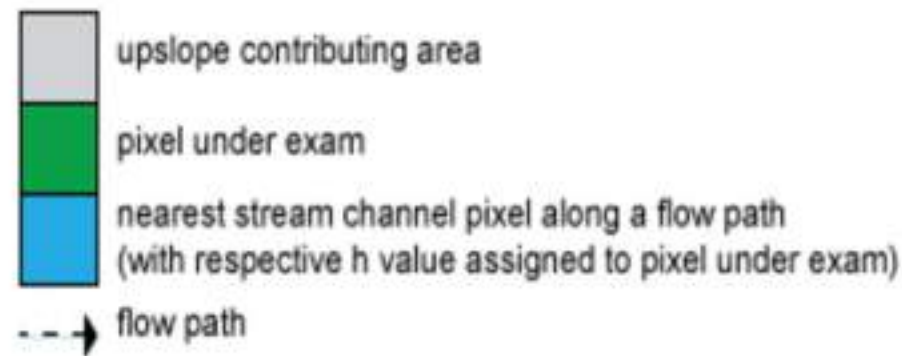
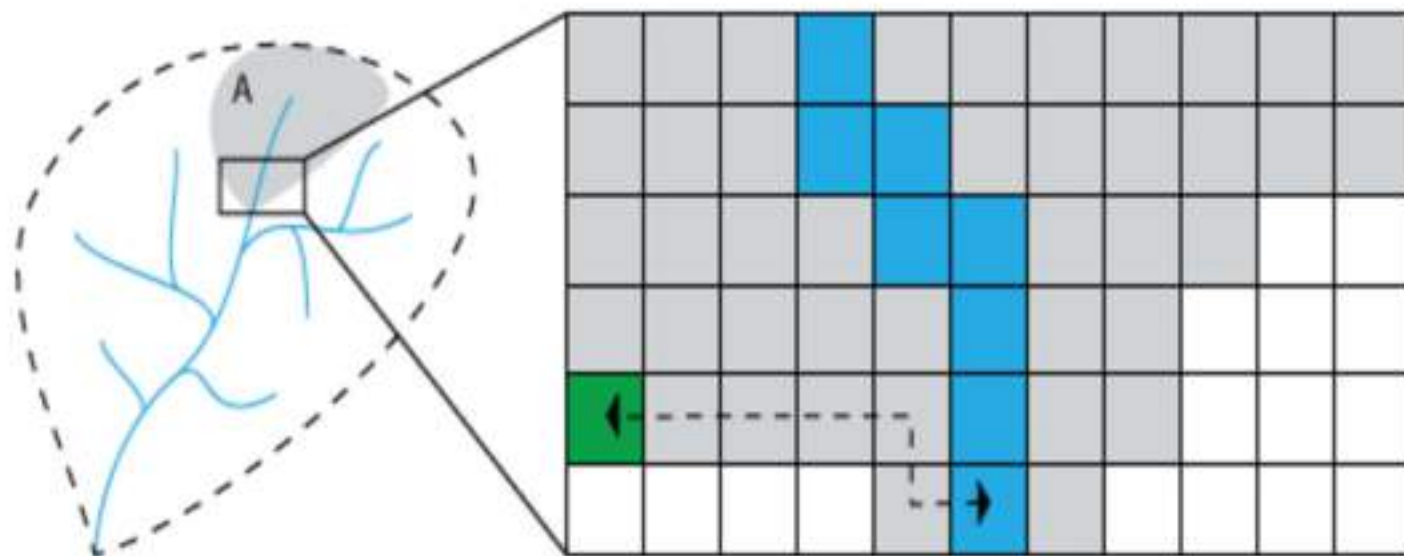
## **Motivations:**

- Need for a consistent flood hazard characterization across large floodplains
- Heterogeneities and gaps in current flood hazard and risk mapping at national scale
- Traditional approaches are still resource intensive

# DEM-based flood-hazard characterization: Geomorphic Flood Index (GFI)

$$GFI^1 = \ln \left( \frac{h}{H} \right)$$

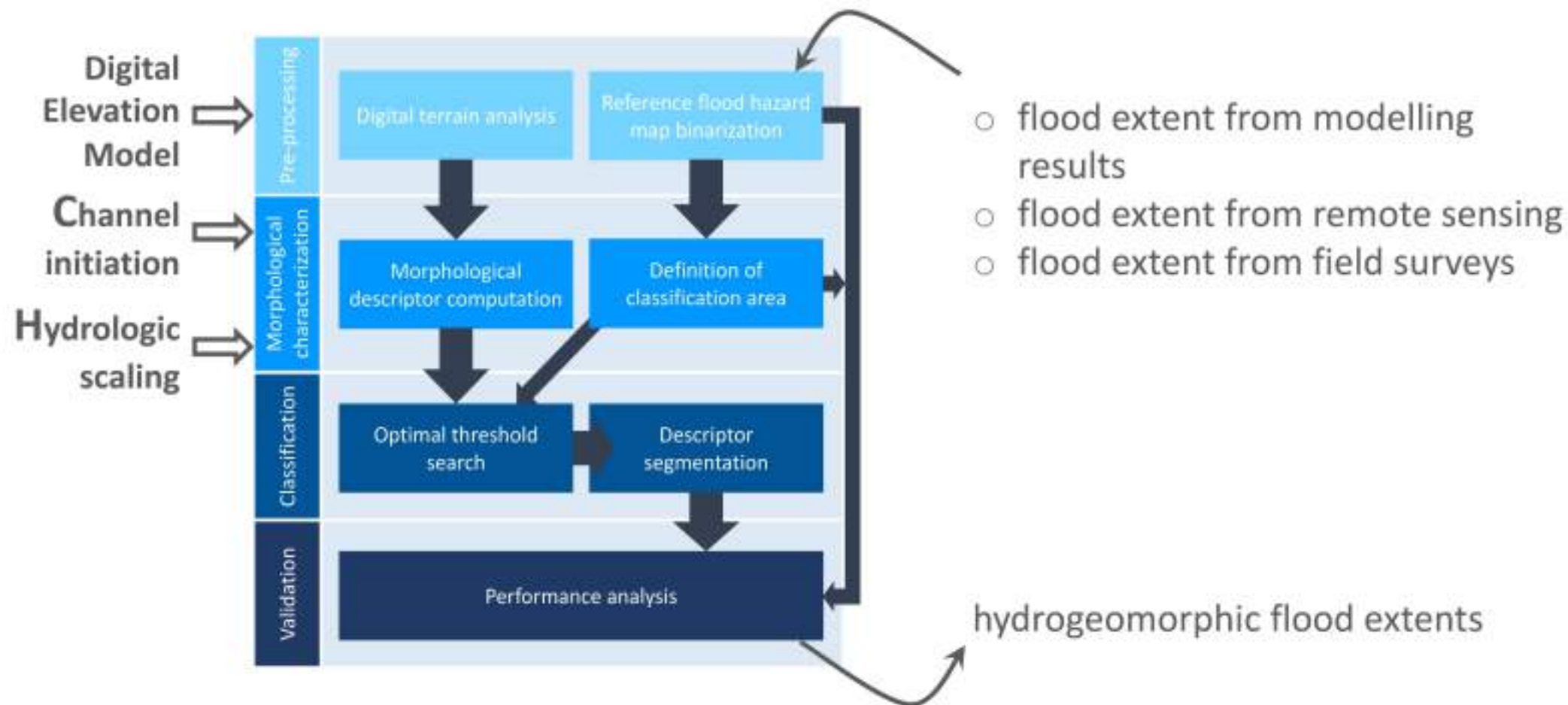
- $h = bA^n$ , empirical power law [m]
- $H$ , elevation difference<sup>2</sup> [m]
- $A$ , upslope contributing area [ $km^2$ ]



<sup>1</sup> Samela et al., Adv. Water. Resour., 2017

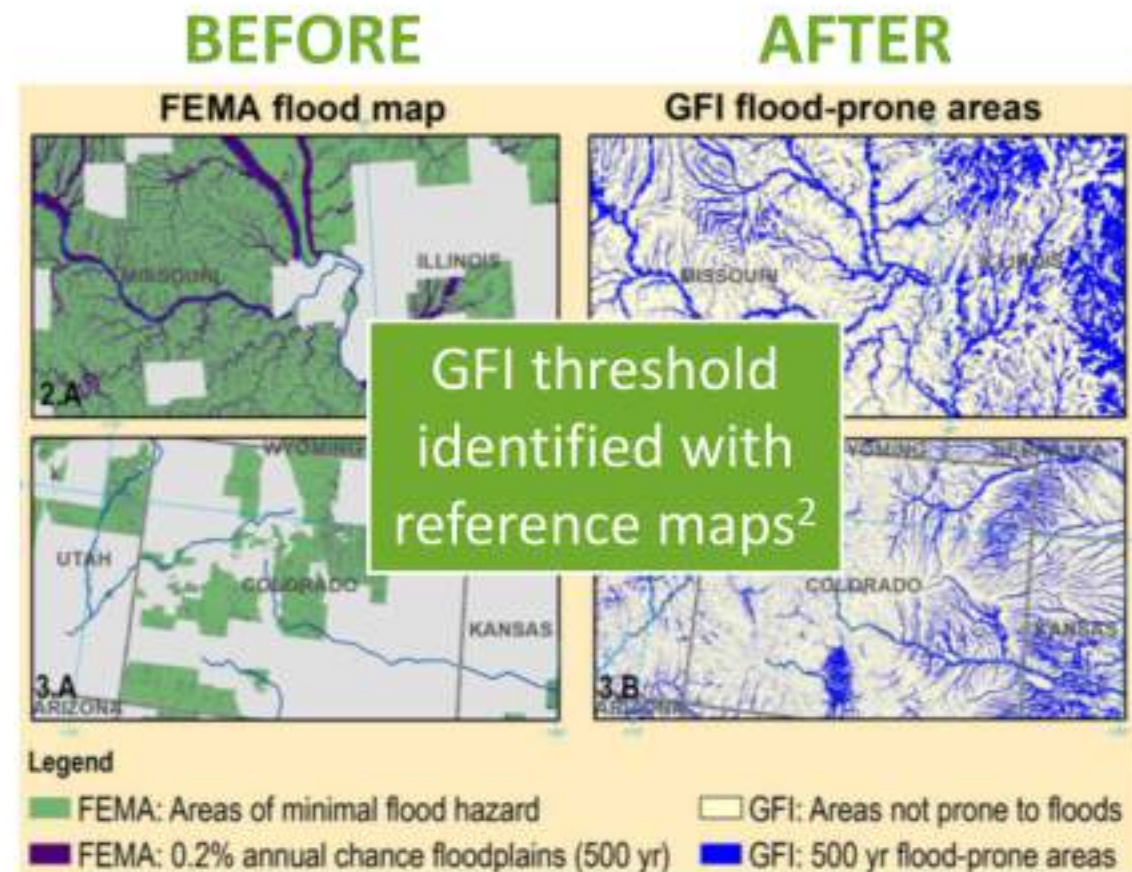
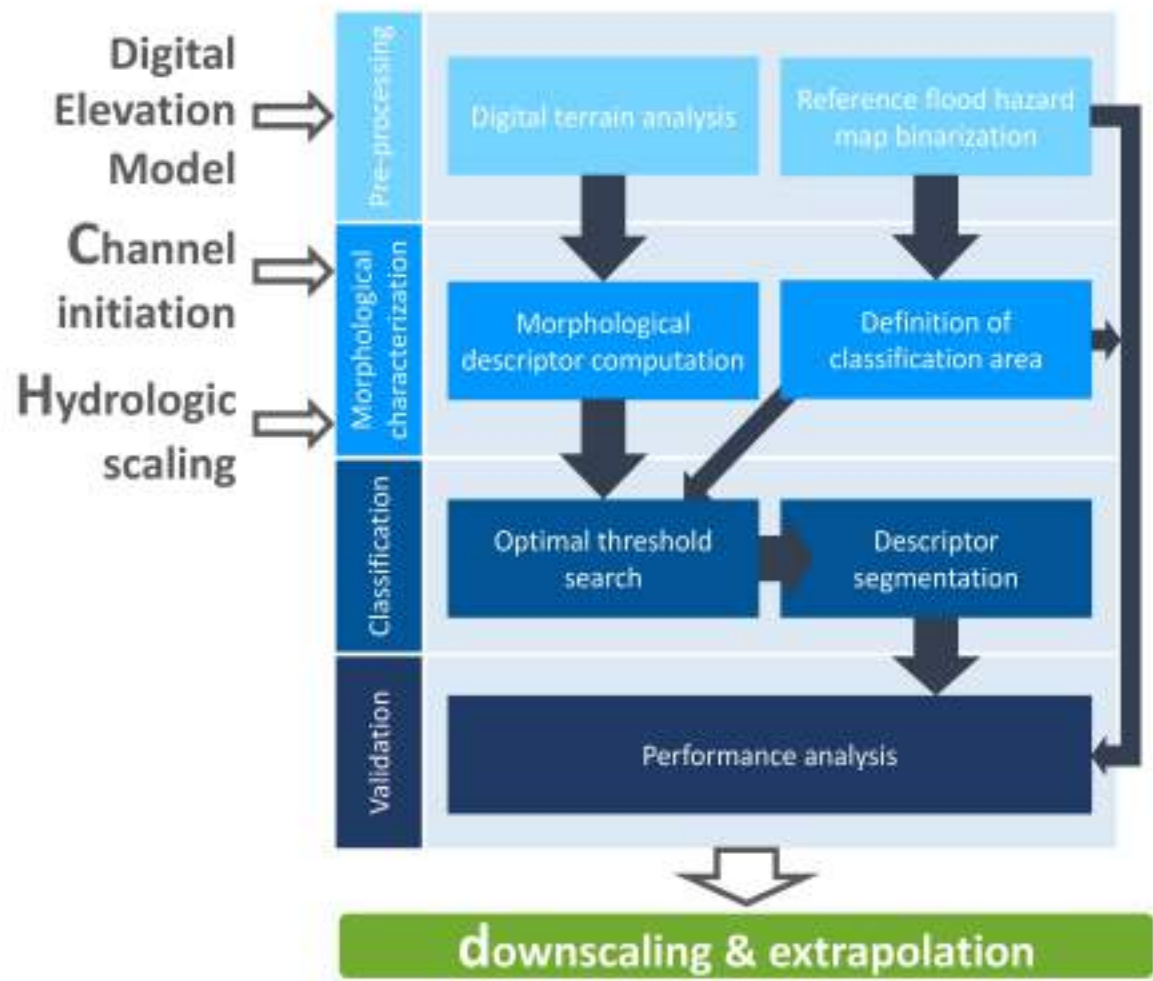
<sup>2</sup> Nobre et al., Hydrol. Proc., 2016

# GFI computation and use: Workflow<sup>1</sup>



<sup>1</sup> Tavares da Costa et al., Env. Software & Mod., 2019

# GFI computation and use: Workflow<sup>1</sup>



<sup>1</sup> Tavares da Costa et al., Env. Software & Mod., 2019

<sup>2</sup> Samela et al., Adv. Water. Resour., 2017

# GFI Classification

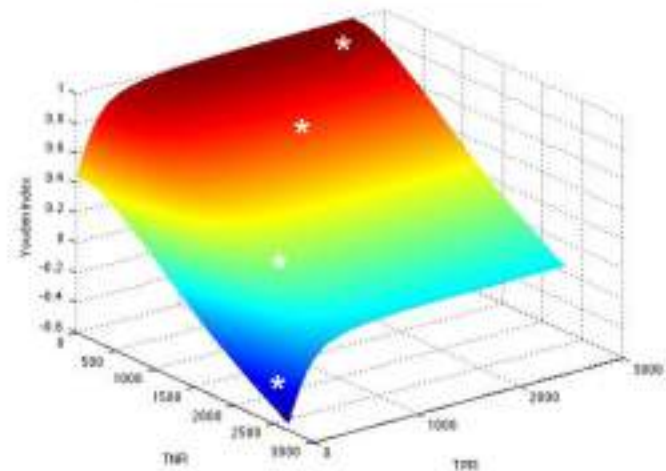
$$GFI = \ln \left( \frac{h}{H} \right)$$

- colour gradient represents different GFI values:
- 1 (cyan) high hazard (near the stream channel)
  - 0 (dark blue) low hazard (away from the stream channel)

GFI layer (25 m) for the Severn river basin (UK) ready to reproduce the reference flood extents from a detailed flood study

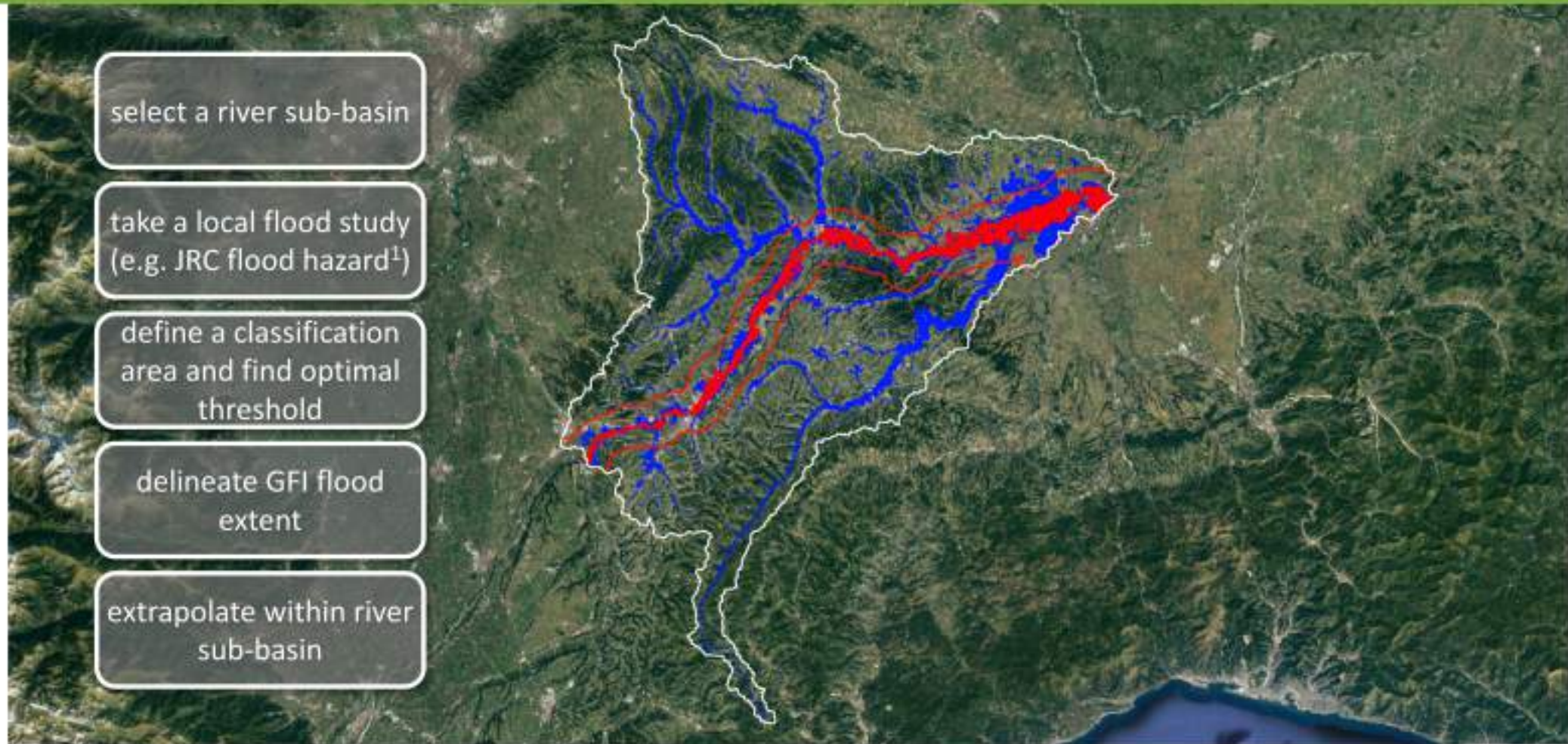
JRC flood hazard<sup>1</sup>  
(approx. 100 m)

Objective function  
 $\max(J = tpr + tnr - 1)$



<sup>1</sup> Dottori et al., European Commission, Joint Research Centre, 2016

# GFI Delineation: example



<sup>1</sup> Dottori et al., European Commission, Joint Research Centre, 2016



# 2<sup>nd</sup> part: Pluvial Flooding

## **SAFERPLACES research goal:**

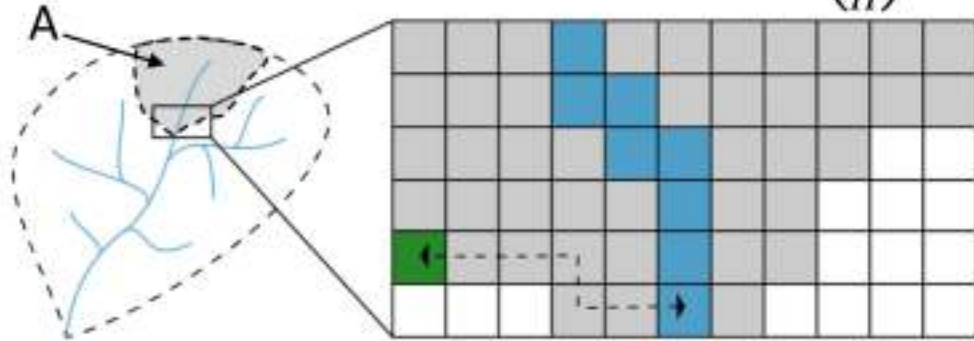
Developing a **fast-processing GIS algorithm** for characterizing pluvial-flooding hazard on the basis of high-resolution Digital Elevation Models (DEMs) of (large) urban areas

## **Motivations:**

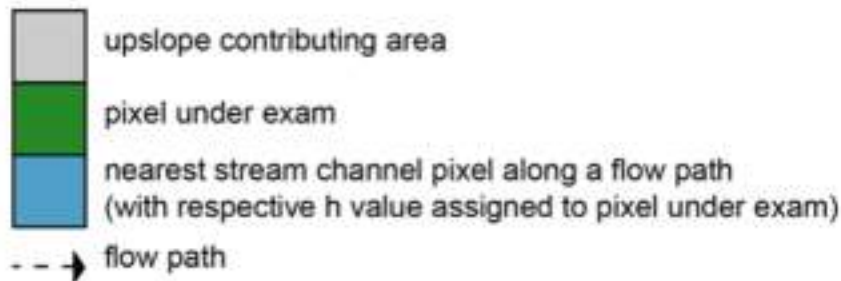
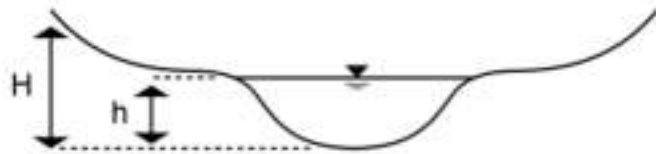
- Availability of LiDAR high resolution DEMs ( $\approx 1\text{m}$ ) is steadily increasing
- Hazard hotspots localization is needed across large or very large urbanized areas (urban sprawls)

# An alternative approach: DEM-based Hierarchical Filling-&-Spilling

Geomorphic Flood Index:  $GFI = \ln\left(\frac{h}{H}\right)$



with  $h = bA^n$ , where  $A$  is the upslope contributing area, and  $H$  is the elevation difference



**Q:** Is GFI suitable for characterizing pluvial-flooding hazard in urbanized areas?

**A:** NO, according to preliminary tests on high-resolution DEM.

**Main reasons:**

- Topographical surfaces are deeply altered (anthropogenic impact)
- Abundance of flat and sub-horizontal areas
- Diffuse presence of sinks and pits
- Extent of flooded areas are largely controlled by rainfall spatial distribution and volume



# An alternative approach: DEM-based Hierarchical Filling-&-Spilling

*Journal of Hydrology*, 42(1979) 63–75

63

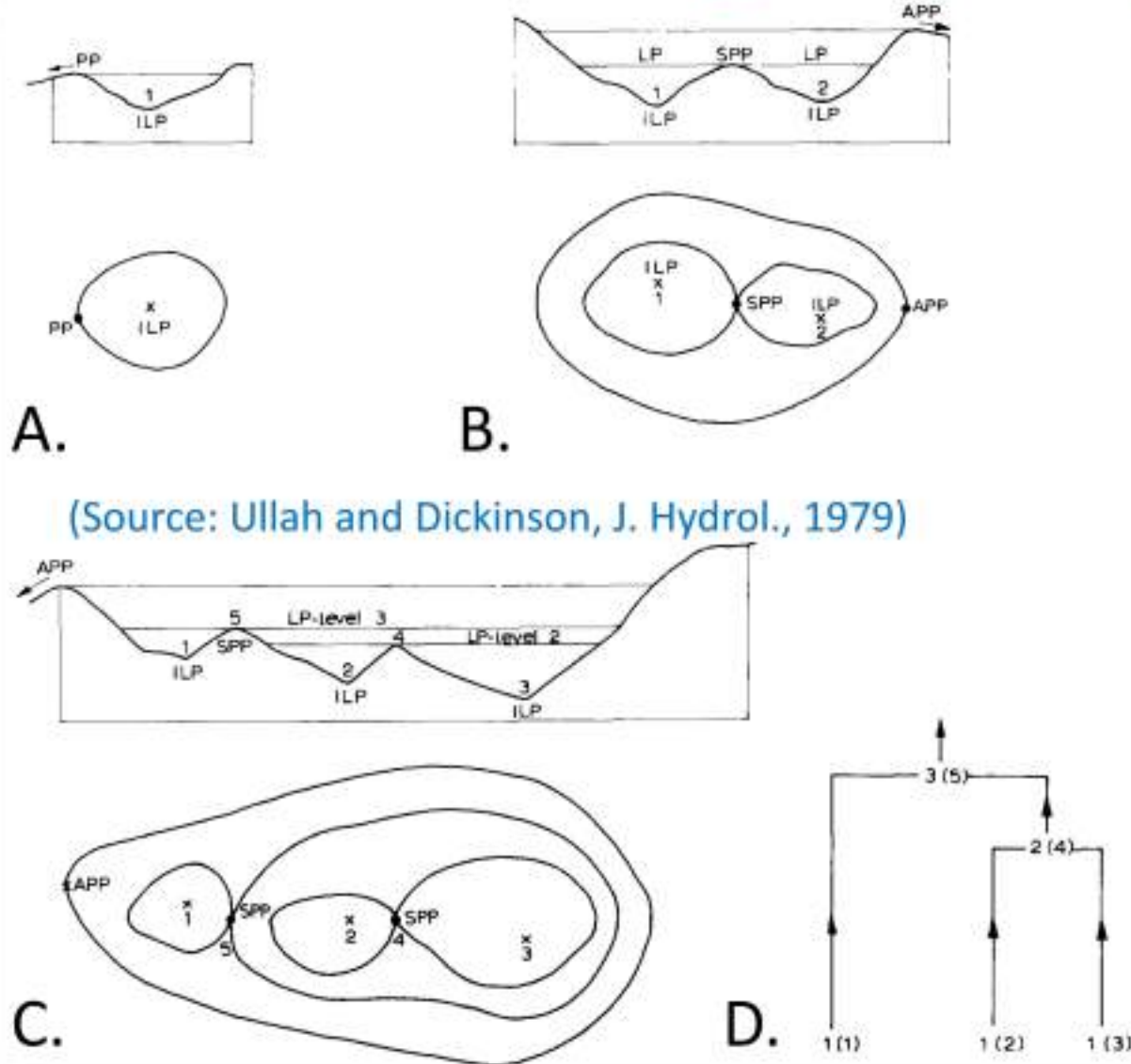
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[1]

QUANTITATIVE DESCRIPTION OF DEPRESSION STORAGE USING A DIGITAL SURFACE MODEL

I. Determination of Depression Storage

W. ULLAH\* and W.T. DICKINSON



E.g. Ullah and Dickinson (J. Hydrol., 1979), illustrate a 4-direction DEM-based algorithm.

- A. Simple depression (first-order basin)
- B. Complex depression (second-order basin)
- C. Complex depression (third-order basin)
- D. Link and order list: order(basin no.)

## Notation

**ILP:** initial low point

**SPP:** shared pour point

**APP:** active pour point



# An alternative approach: DEM-based Hierarchical Filling-&-Spilling

*Journal of Hydrology*, 42(1979) 63–75  
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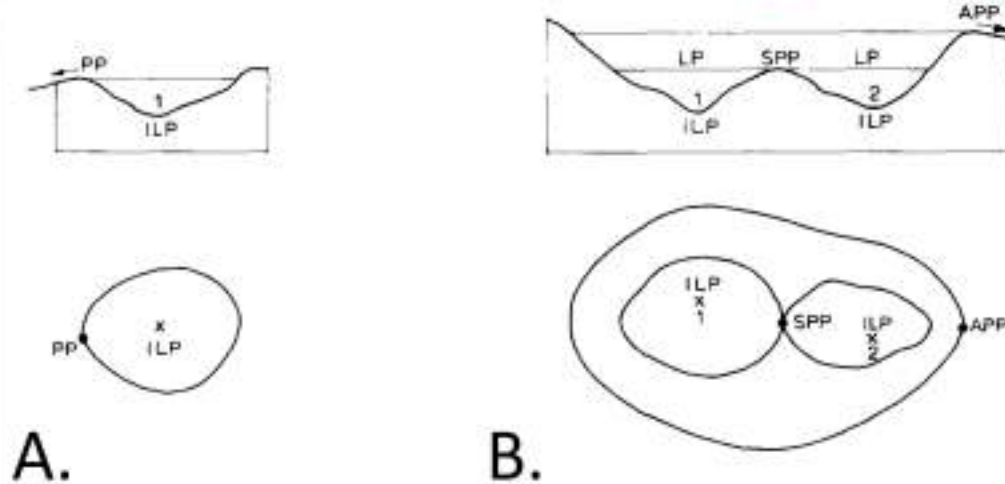
63

[1]

## QUANTITATIVE DESCRIPTION OF DEPRESSION STORAGE USING A DIGITAL SURFACE MODEL

### I. Determination of Depression Storage

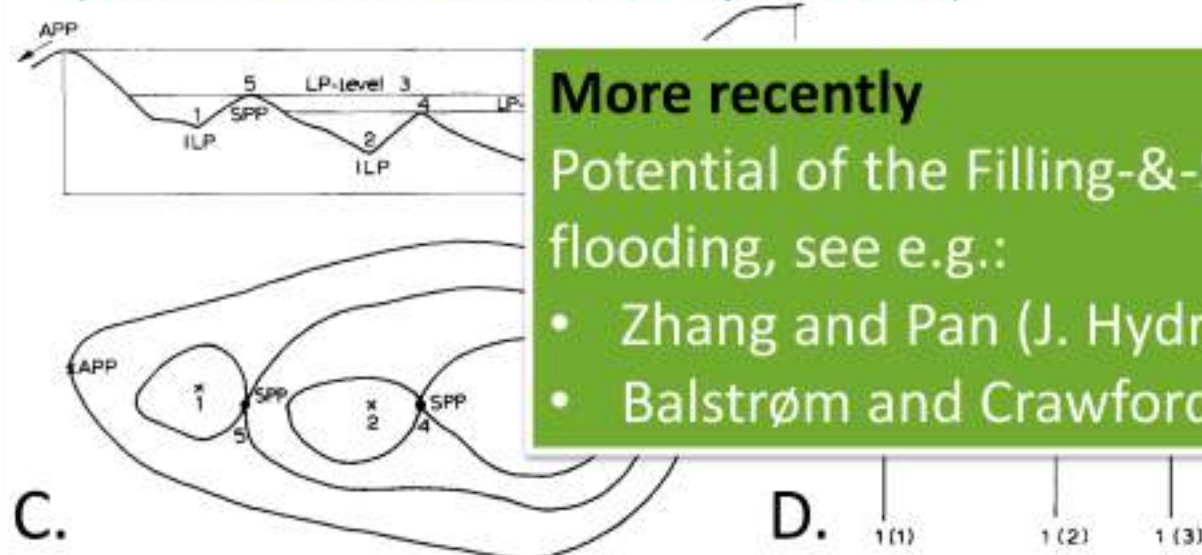
W. ULLAH\* and W.T. DICKINSON



E.g. Ullah and Dickinson (J. Hydrol., 1979), illustrate a 4-direction DEM-based algorithm.

- A. Simple depression (first-order basin)
- B. Complex depression (second-order basin)
- C. Complex depression (third-order basin)

(Source: Ullah and Dickinson, J. Hydrol., 1979)



**More recently**  
 Potential of the Filling-&-Spilling tested for pluvial flooding, see e.g.:

- Zhang and Pan (J. Hydrol., 2014)
- Balstrøm and Crawford (Comp. Geosci., 2018)

order(basin no.)

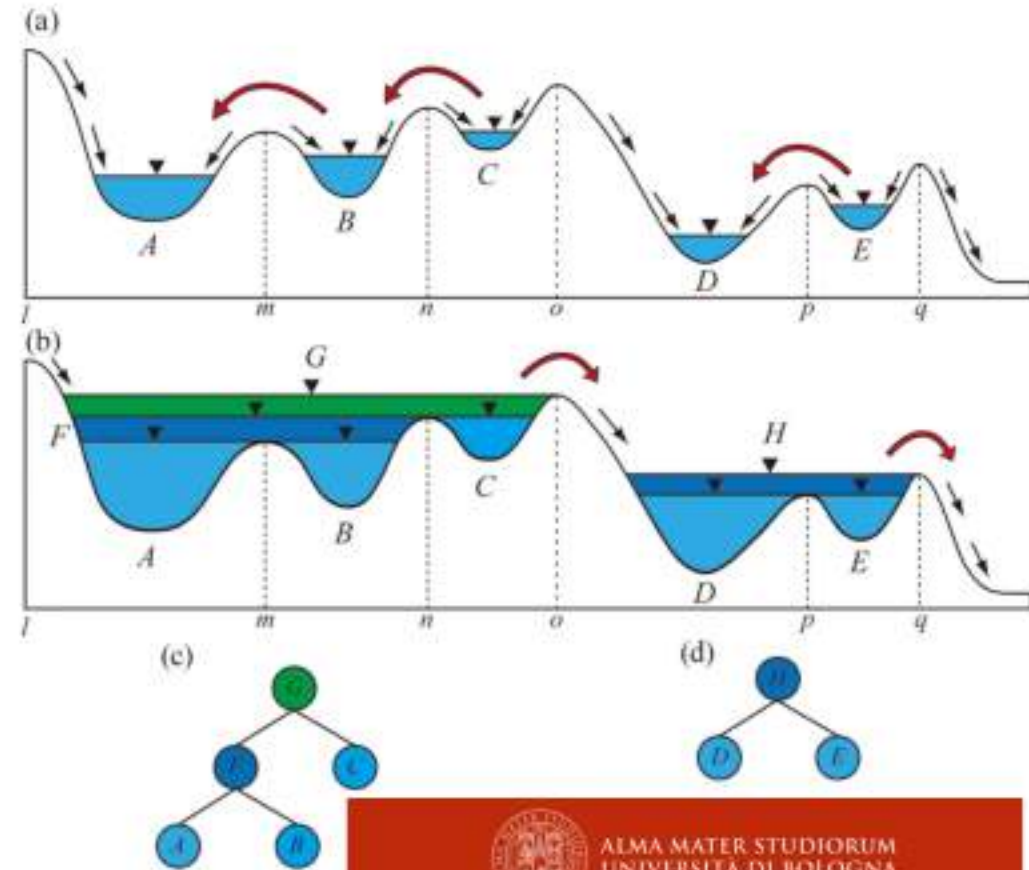
# DEM-based pluvial-flooding hazard characterization:

## Proposed approach

### Main simplifying assumptions

- Dynamics is neglected, rainfall water volume flows downstream instantaneously
- Water flows according to the “D8” method (see e.g. O’Callaghan and Mark, Comp. Vision. Graph. & Image Proc., 1984).
- The terrain is an impermeable surface (relaxed).
- The spatial distribution of rainfall is uniform (relaxed)

(Source: Wu and Lane, HESS, 2017)



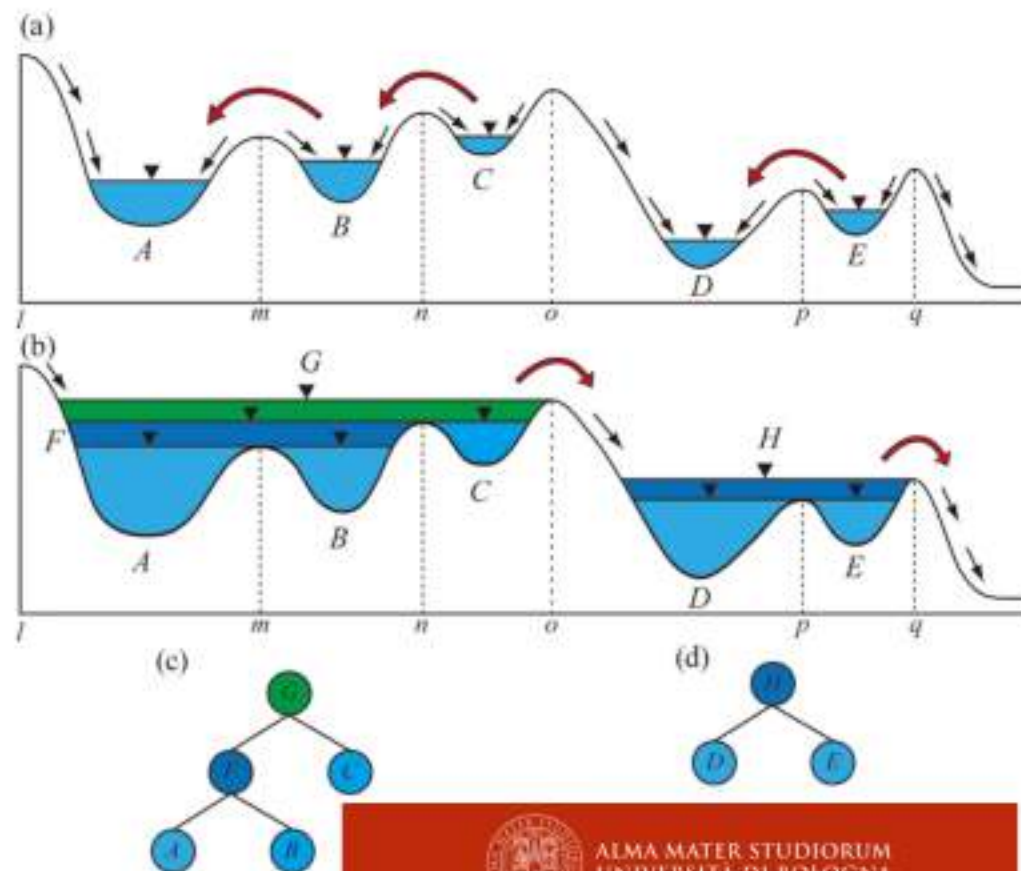
# DEM-based pluvial-flooding hazard characterization:

## Proposed approach

### Algorithm main steps

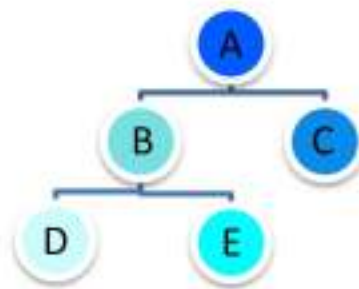
- 1) Definition of **horizontal hydrological hierarchy**: identification of blue-spots (first-level depressions, **G** and **H** in the figure) through **DEM pit-filling**, and corresponding pour-point and contributing watersheds;
- 2) Definition of **vertical hierarchical structure within each blue-spot**, the higher level depressions (**A**, **B**, **C**, **D**, **E**, and **F** in the figure) their hierarchical relationship and water-level / volume relationship through **Top-down level-set method**, Wu et al., JAWRA, 2018)
- 3) Identification of **flooded areas for a given rainfall volume**, **partial filling** is addressed through a **Bottom-up level-set method**

(Source: Wu and Lane, HESS, 2017)



# DEM-based pluvial-flooding hazard characterization:

## Proposed approach



### STEP 2)

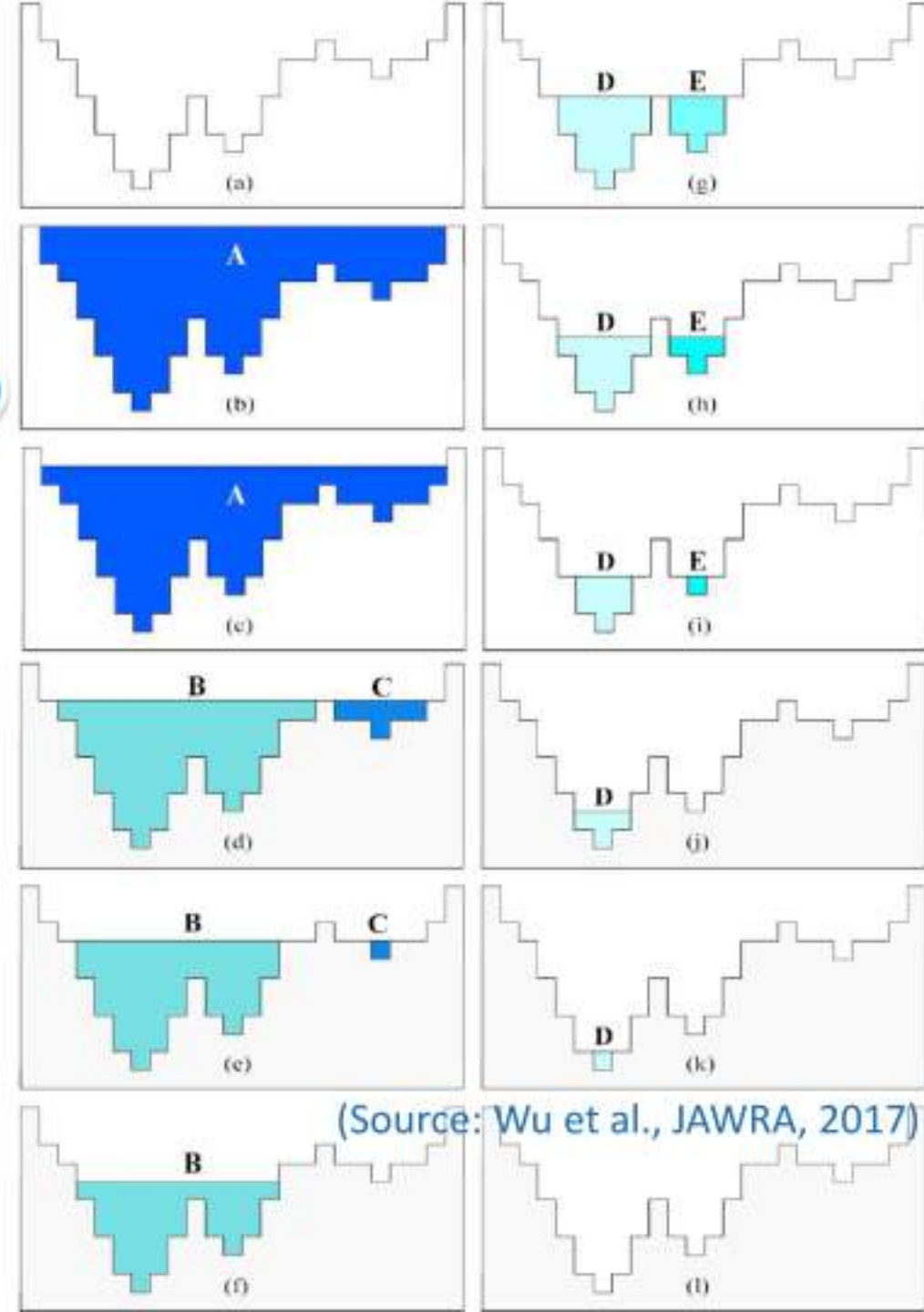
**Top-down level-set method** is presented in:

“Efficient delineation of nested depression hierarchy in digital elevation models for hydrological analysis using level-set methods”

Wu et al. (JAWRA, 2018)

From (a) to (l):

1. it starts from a **filled condition** (the blue-spot **A** is full)
2. the **level decreases gradually**, characterizing the water-level/volume relationship
3. the 2<sup>nd</sup> (**B** and **C**) and 3<sup>rd</sup> (**D** and **E**) level depressions are **gradually identified**
4. nested depression hierarchy and water-level/volume relationships are fully characterized



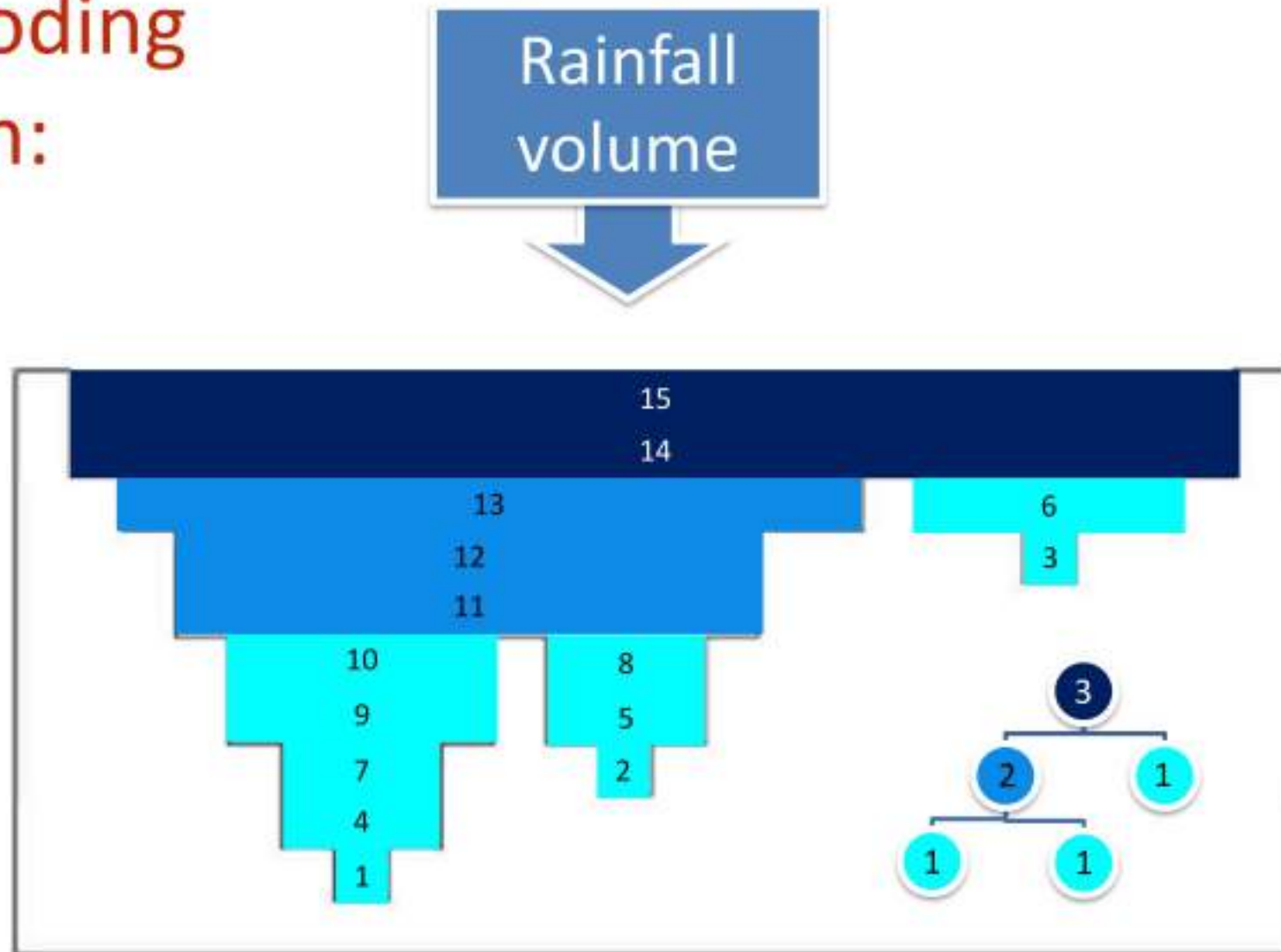
# DEM-based pluvial-flooding hazard characterization:

## Proposed approach

### STEP 3)

**Bottom-up level-set method** is used for quantifying **partial filling** in nested higher-level depressions:

1. it starts from an **empty condition** (the blue-spot A is empty)
2. according to their vertical hierarchy, **nested depressions are gradually filled** through bottom-up a level-set method
3. gradual filling is performed step-by-step, **rotating depressions** with same hierarchical order



[Samela et al. \(2020\)](#)



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# Lignano: pluvial flooding

Rainstorm, 10-12 September 2017

LIGNANO TODAY

Maltempo in Friuli, Lignano Pineta finisce sott'acqua

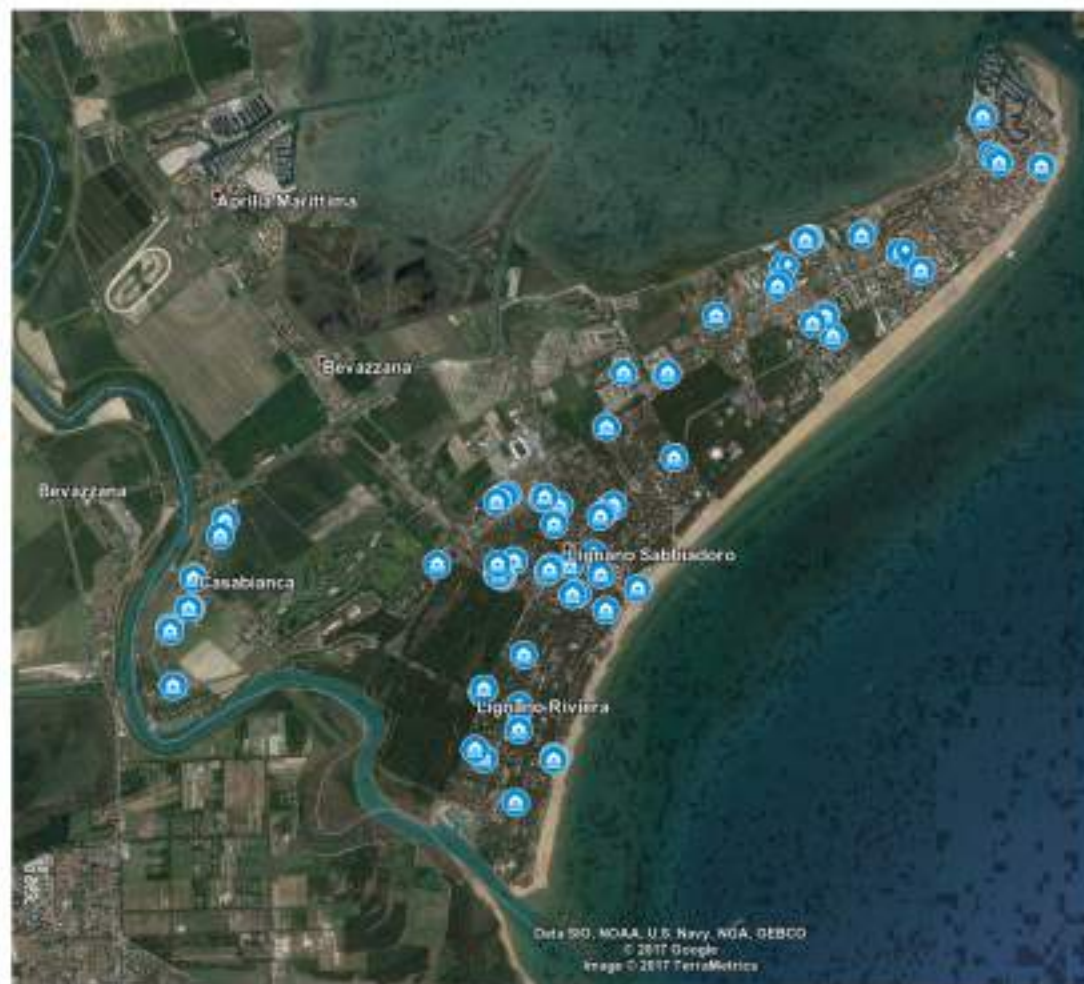
Foto: Angelo Neri / Contrasto, Salvatore Di Biase / Anzenberger / Lightbox

1



**Large Pluvial Flooding**

Resulting from two intense rainstorms



**Flooded locations**

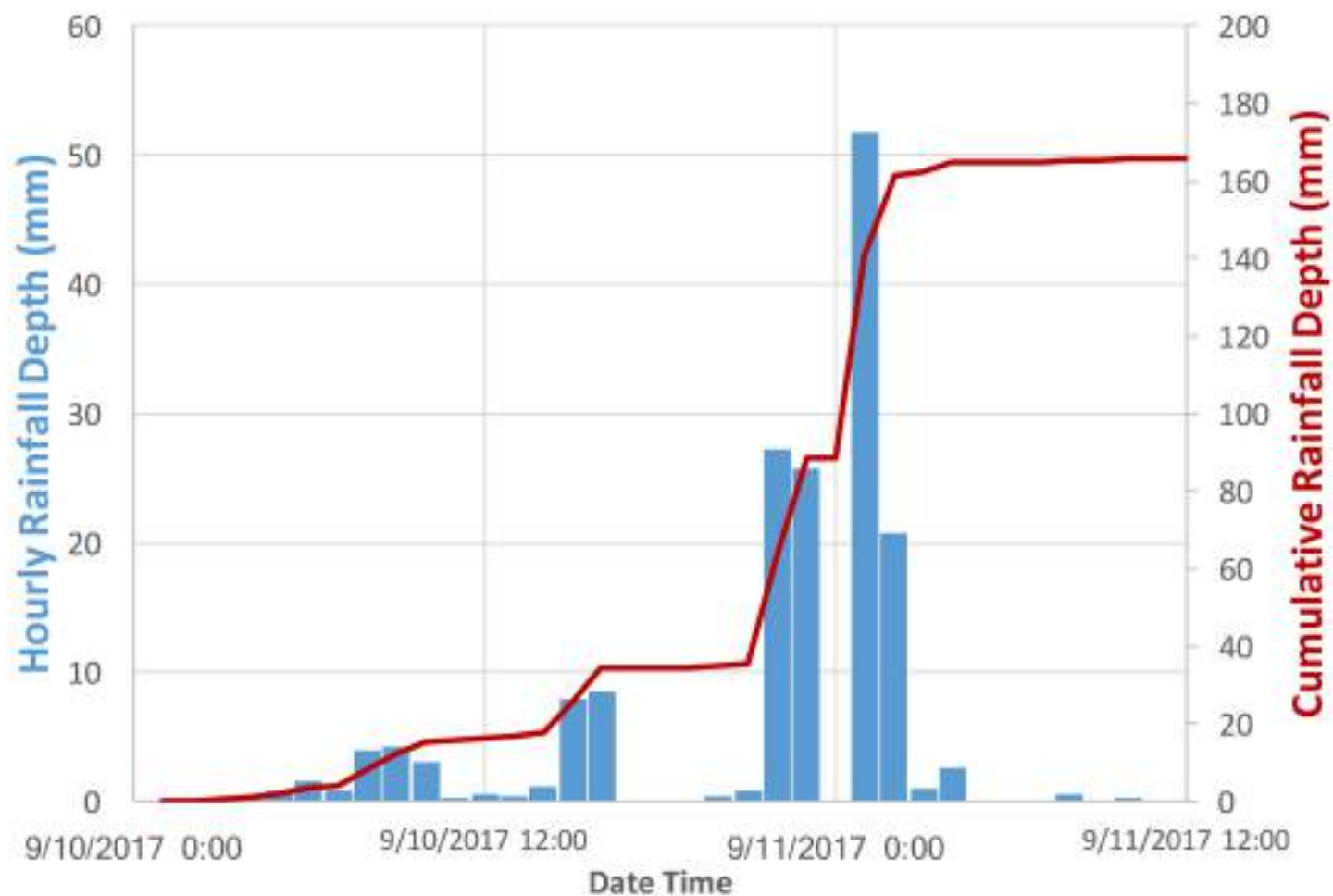
Map of recorded emergency calls



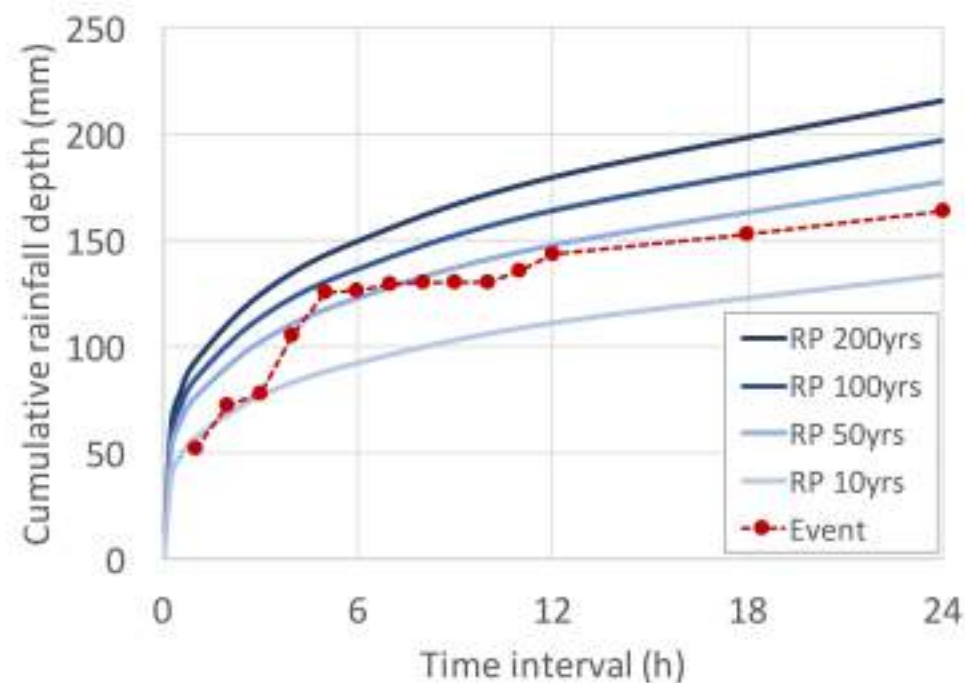
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# Lignano: pluvial flooding

Rainstorm, 10-12 September 2017



## Depth-duration frequency curves



# Lignano: pluvial flooding

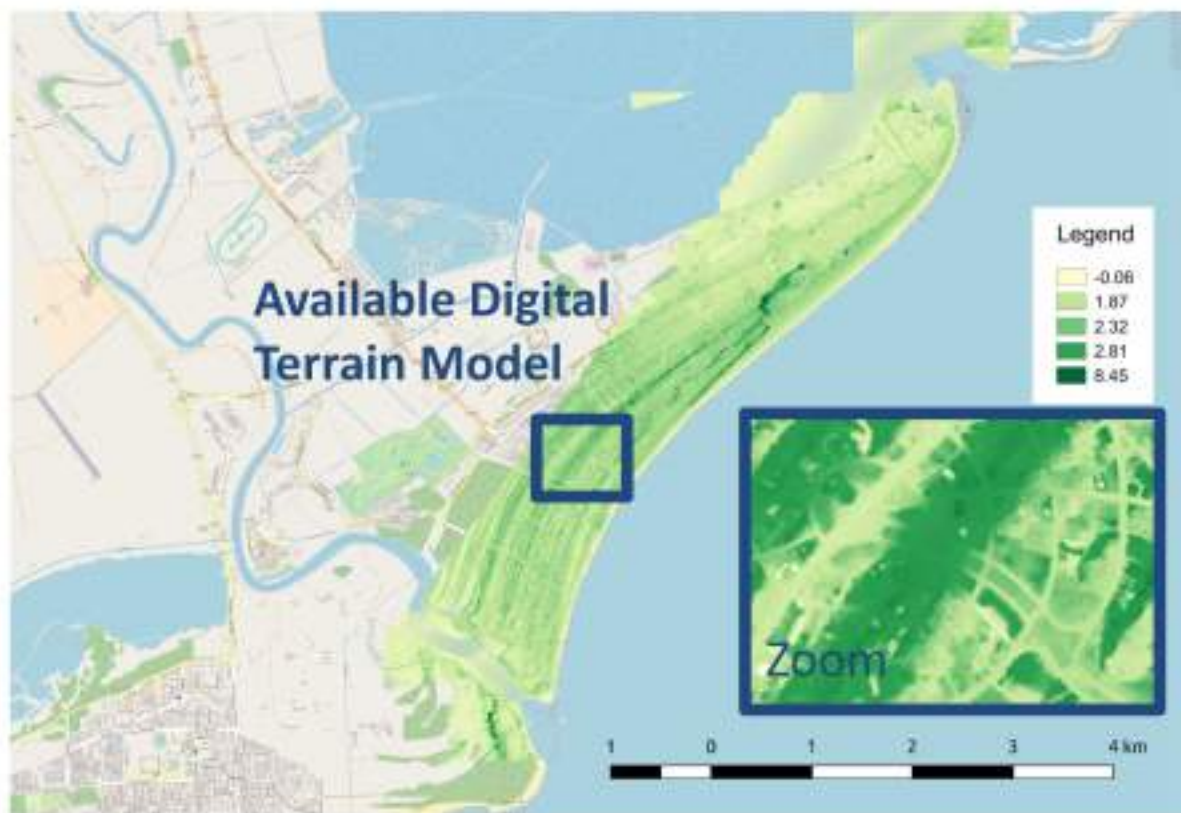


## Land-use dynamics:

Touristic vocation resulted in intense urban development in the last 30 years (source: Google Earth)

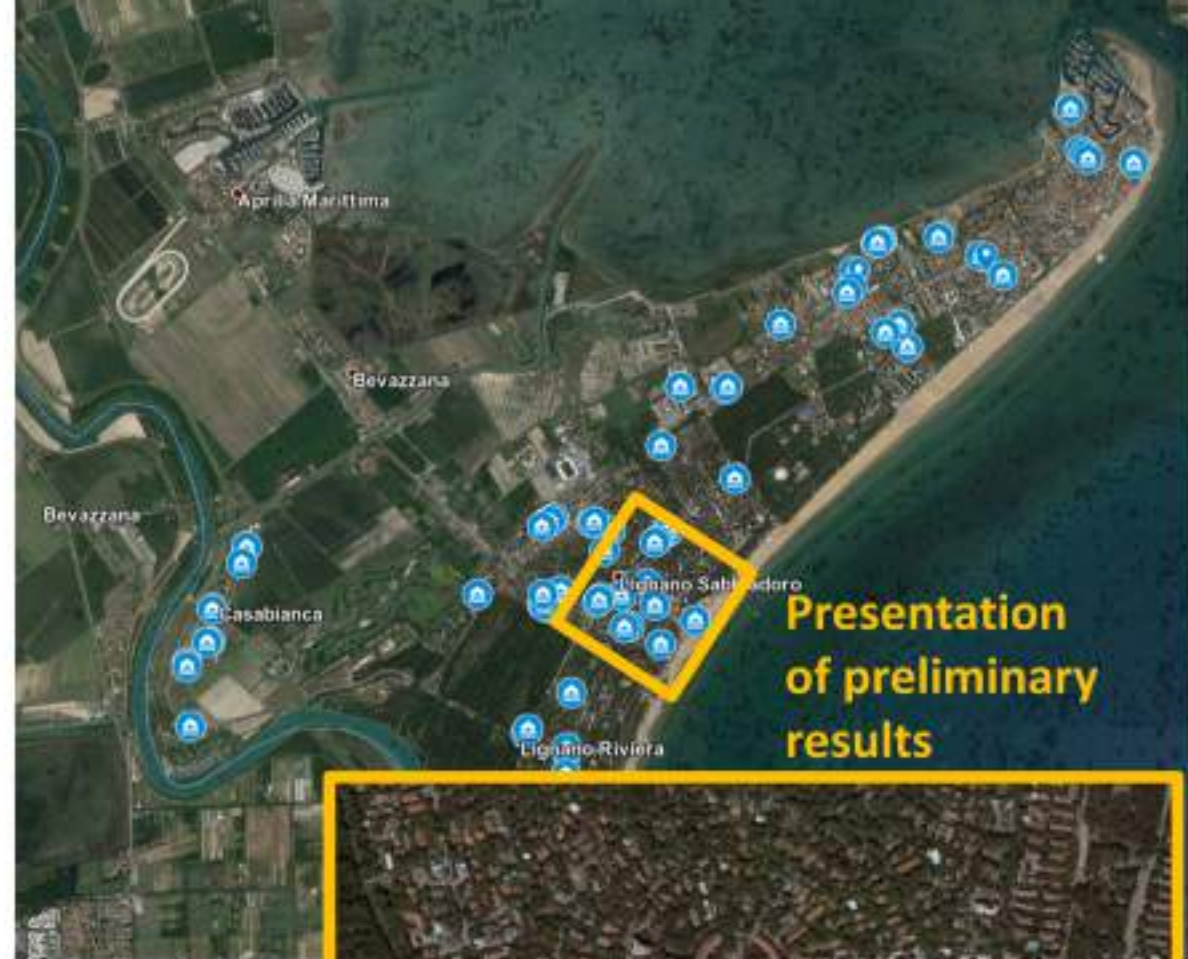


# Available DEM and area of interest



## LIDAR DTM

Ministero dell'Ambiente e della Tutela del Territorio e del Mare  
(Creation 2009-06-01, resolution 2m)

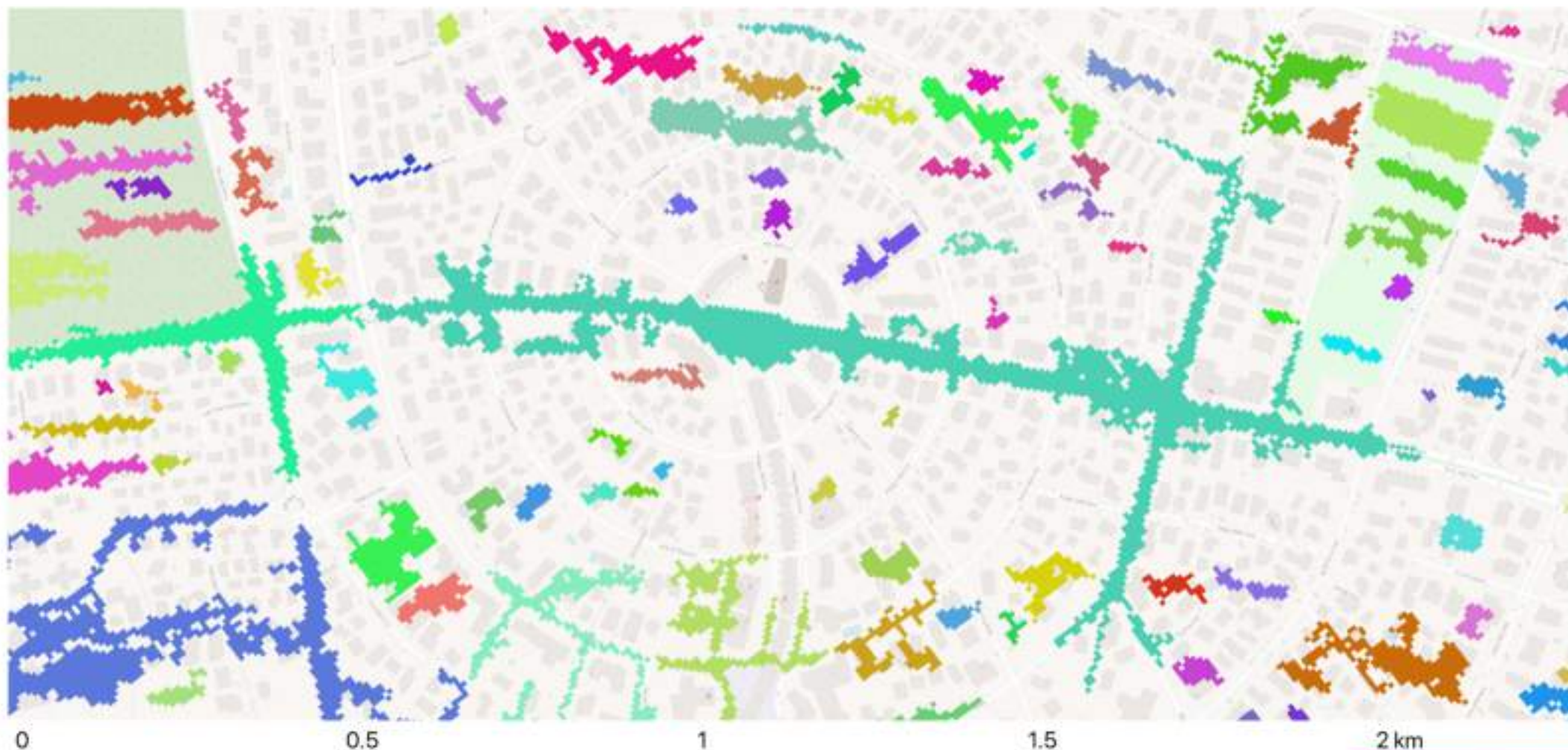


Presentation of preliminary results



# DEM pre-processing: application

Identification of: (a) blue-spots (binary maps, each blue-spots has a unique ID)



# DEM pre-processing: application

Identification of: (a) blue-spots (binary maps, each blue-spots has a unique ID), (b) spilling points



# DEM pre-processing: application

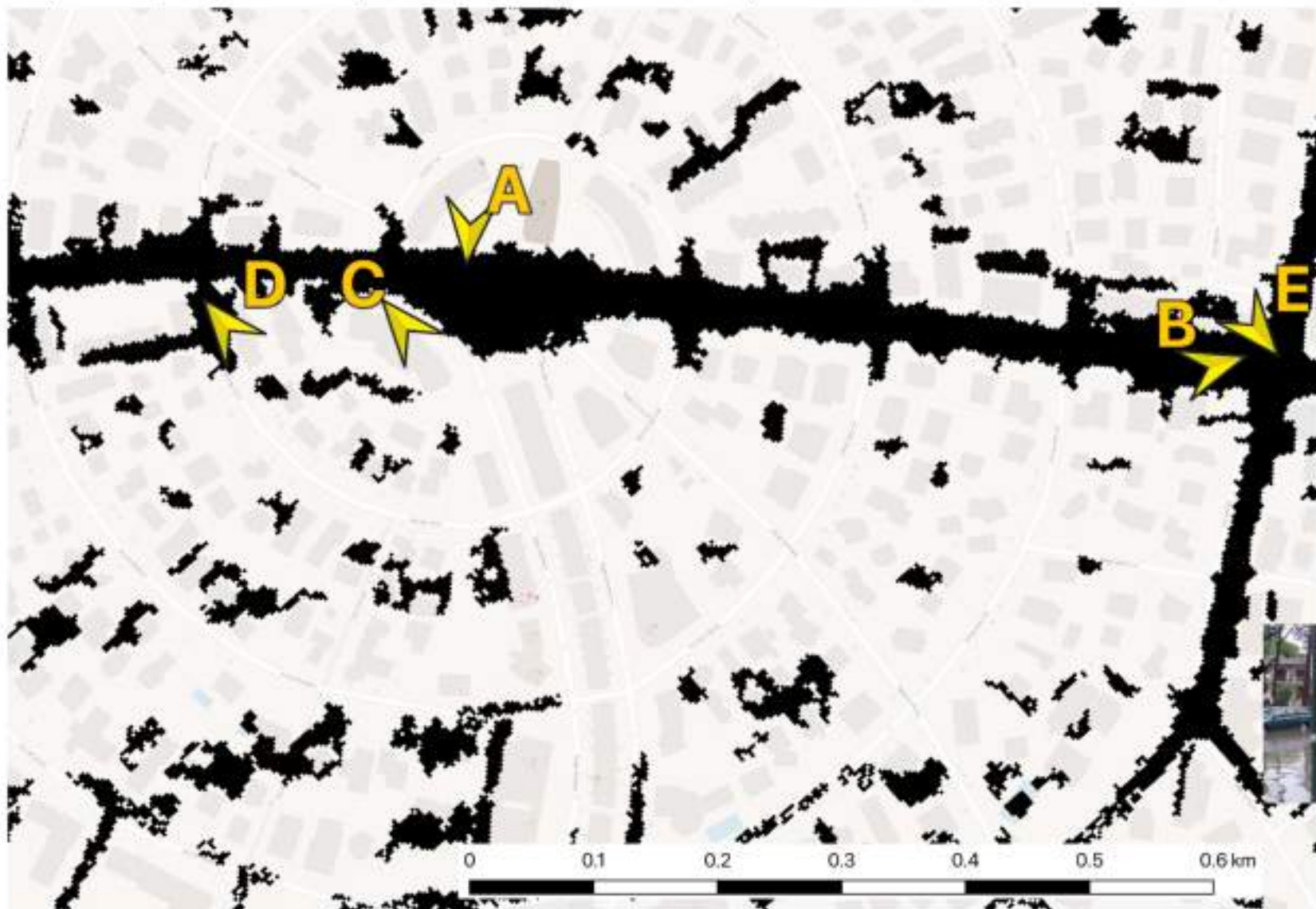
Identification of: (a) blue-spots (binary maps, each blue-spots has a unique ID), (b) spilling points, and (c) watersheds



# Results: ground evidence on flooded areas

Sept. 11, 2017 event, cumulated rainfall depth  $\approx 125$  mm (5-hour time interval)

(source: local TV-news footage, TRG Friuli-Venezia-Giulia)

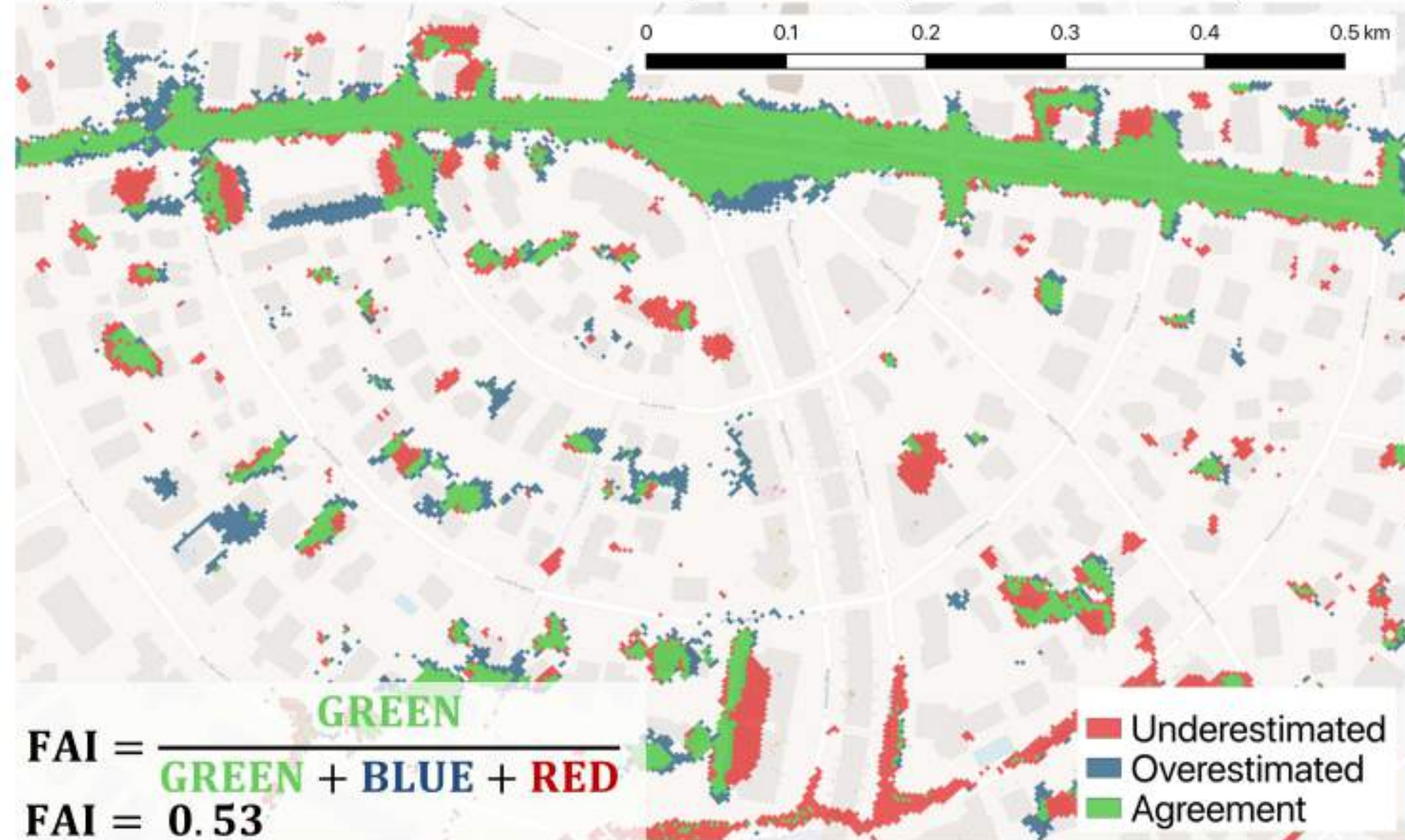


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# Results: comparison with a hydrodynamic model output

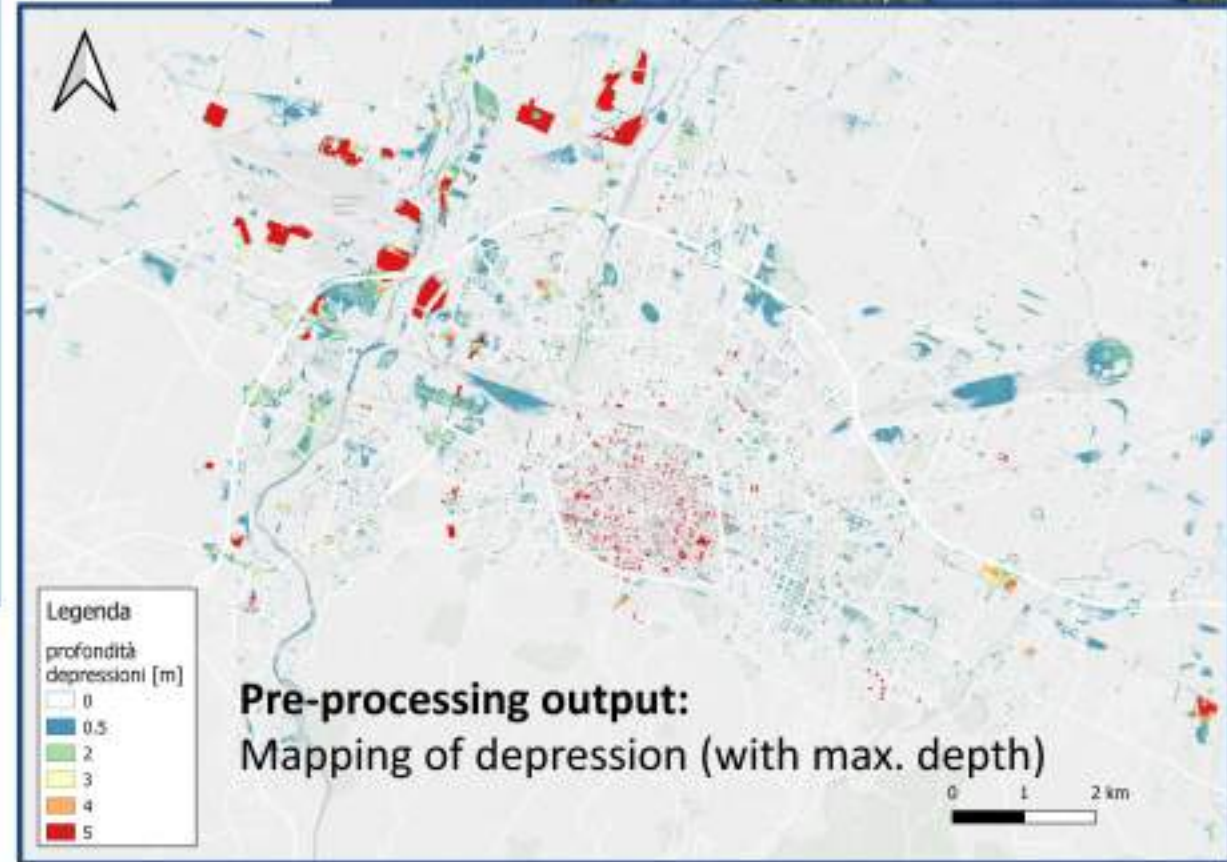
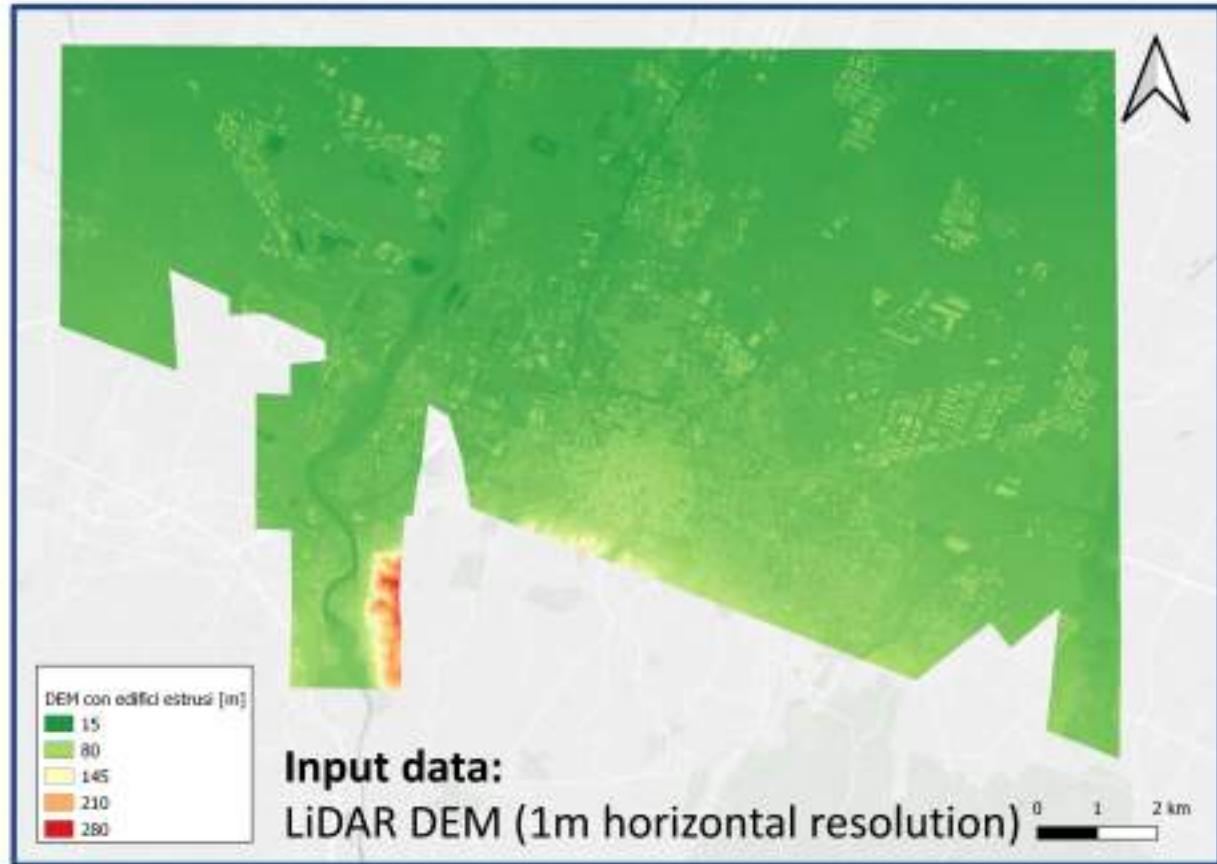
Sept. 11, 2017 event, cumulated rainfall depth  $\approx 125$  mm (time interval 5 hours)



## Flooded areas

- DEM-based algorithm
- Maximum water level simulated through a fully-2D hydrological-hydrodynamic model solving the shallow water equations (benchmark model, developed by IBH, <https://ib-humer.at>)

# Bologna: spatially distributed rainfall data (weather radar)



# Bologna: Spatially distributed rainfall data (weather radar)

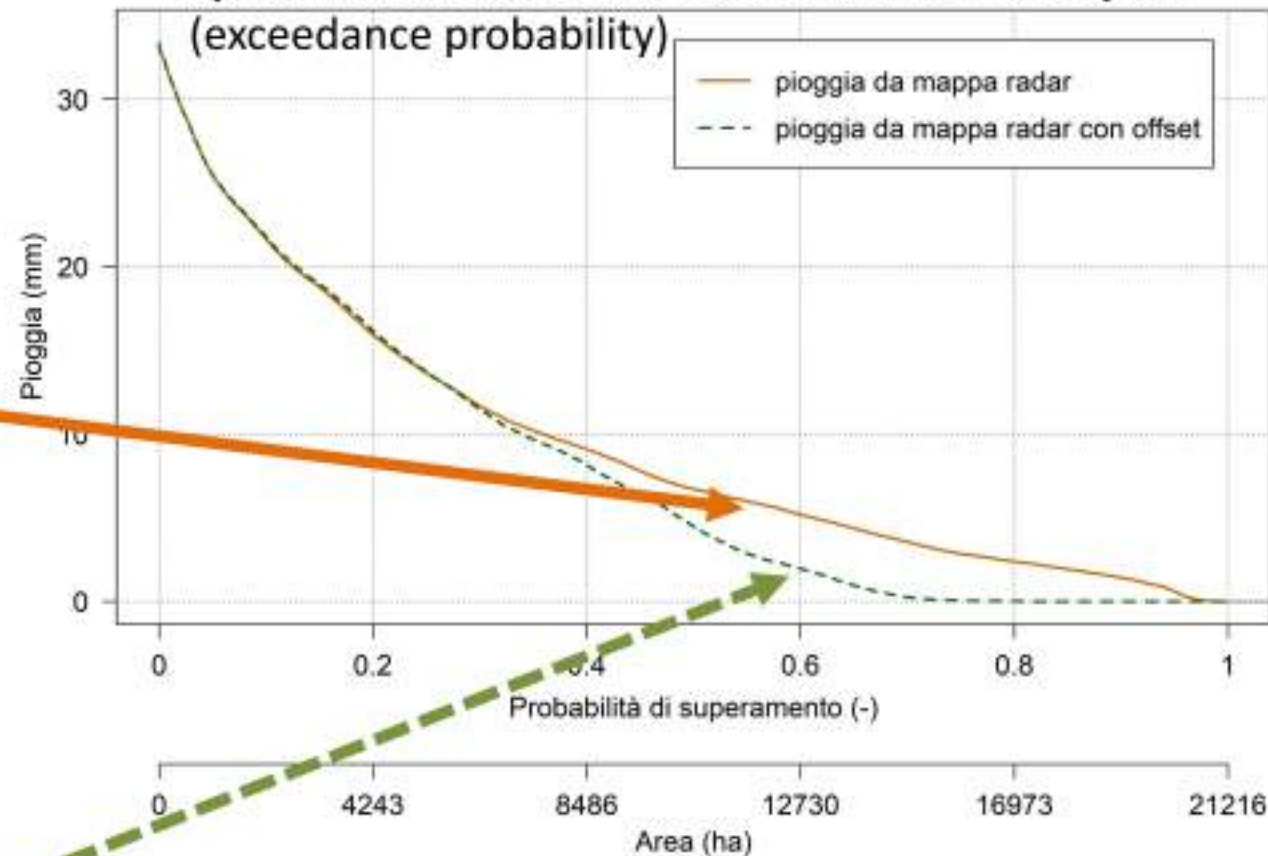
**Real event (29/05/2018):**  
Cumulated 1h rainfall depth  
(estimate return period:  
ca. 50 years)



**Synthetic event:**  
Cumulated 1h rainfall depth  
(6km off-set Eastward)



**Spatial distribution of 1h cumulated rainfall depths (exceedance probability)**



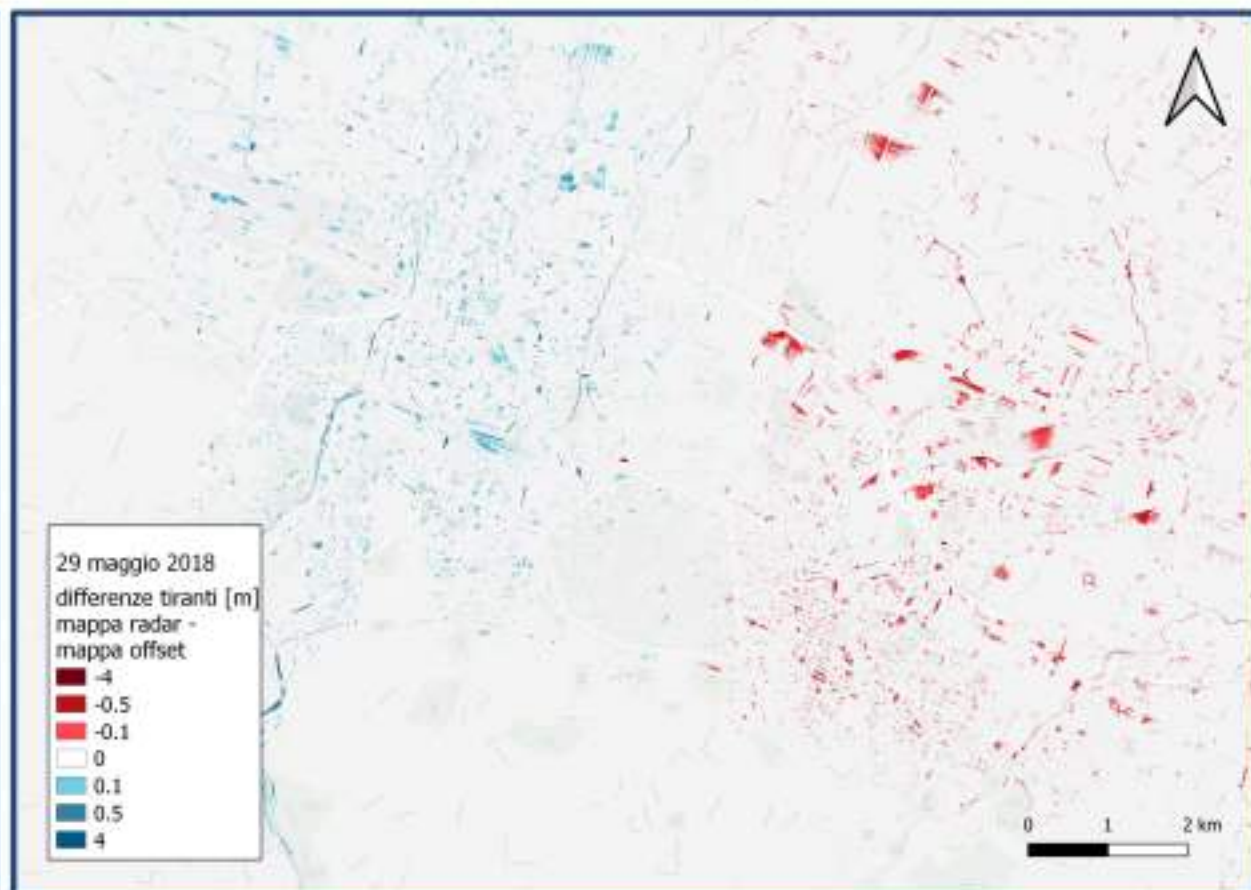
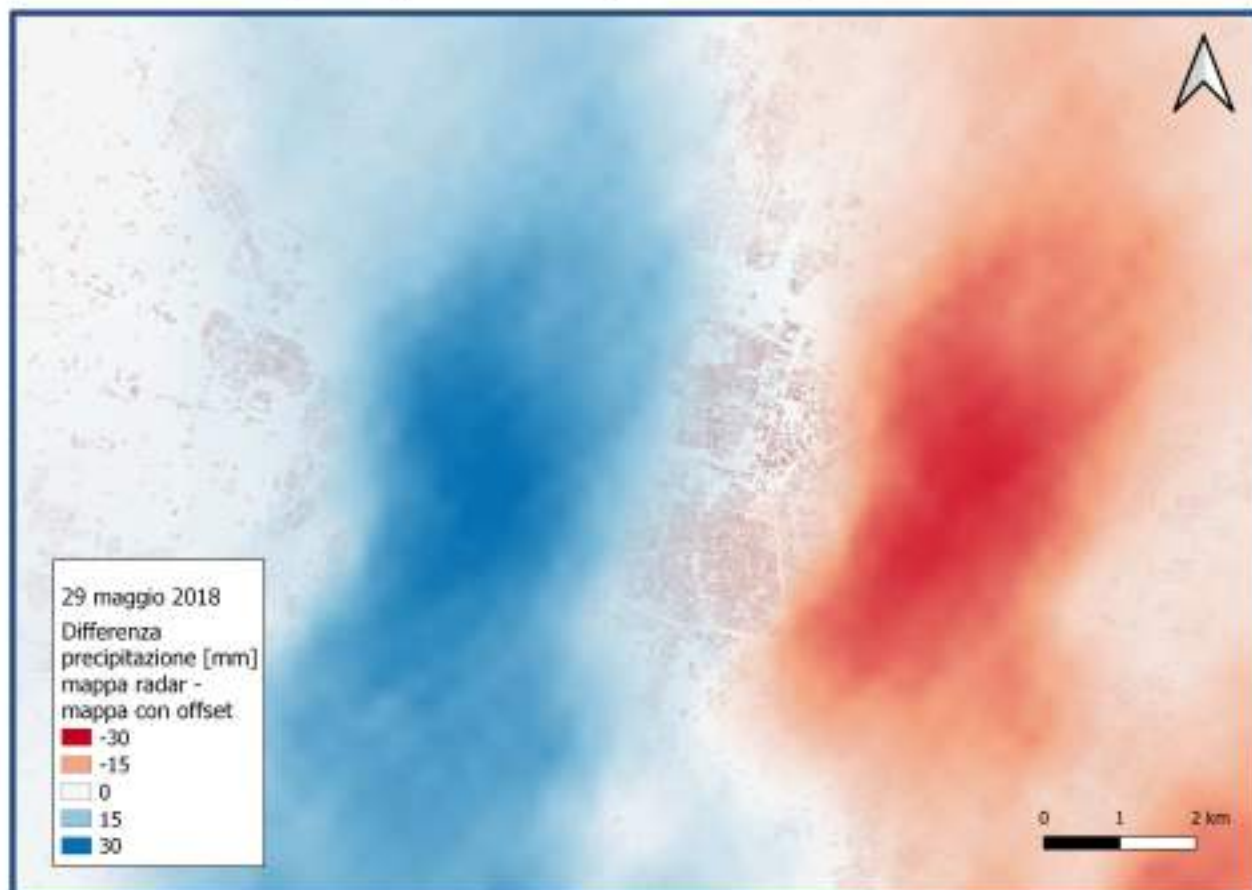
# Bologna: Spatially distributed rainfall data (weather radar)

## Real vs. synthetic event

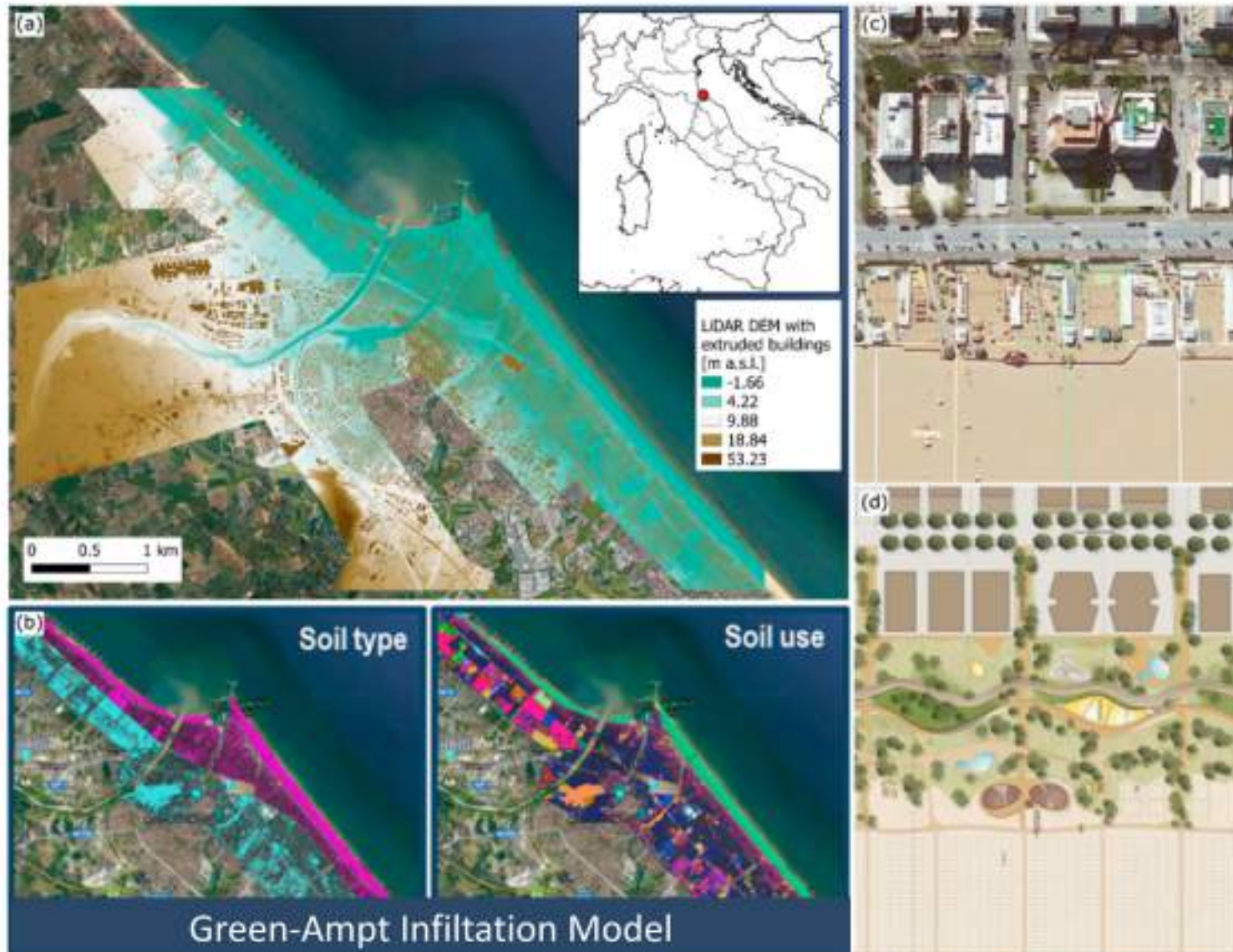
Difference in terms of cumulative 1h  
rainfall depth (real – synthetic)

## Flooded areas

Difference between maximum water depths  
simulated for the real and synthetic events



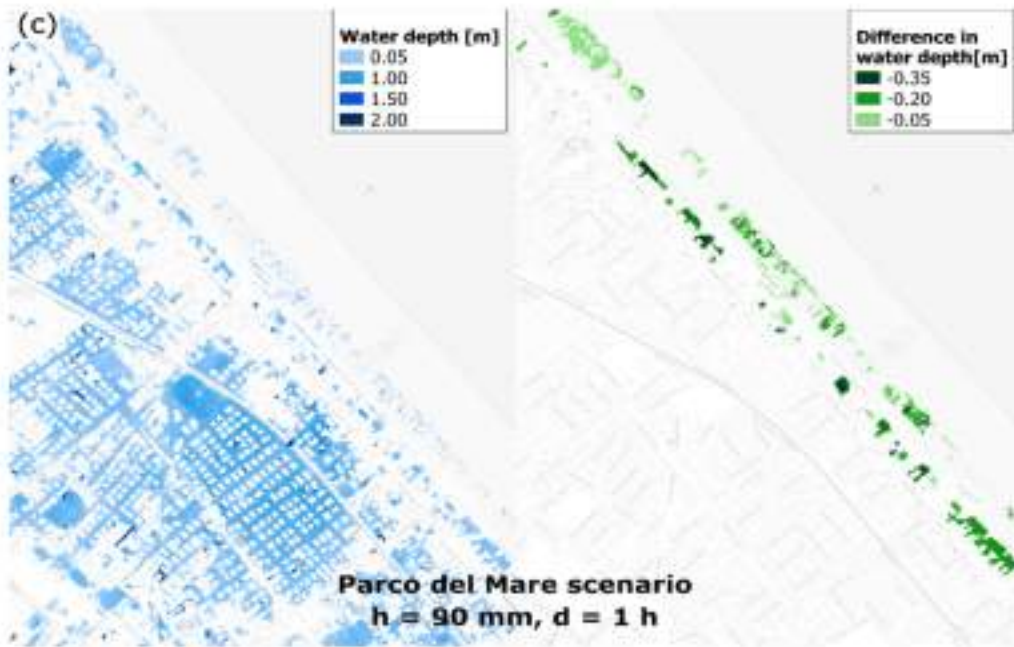
# Rimini: pluvial flooding scenarios



- (a) location of the case study and 1 m LiDAR Digital Elevation Model (DEM)
- (b) soil-type and land-use maps for the study area
- (c) and (d) current layout of the seafront (satellite image) and **future green infrastructure** according to the rehabilitation and renovation project *Parco del Mare*



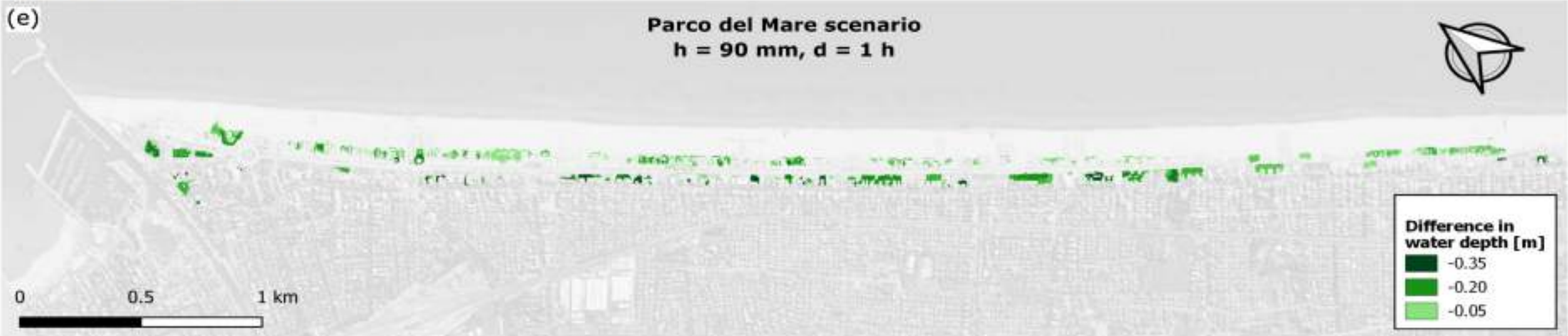
# Rimini: pluvial flooding scenarios



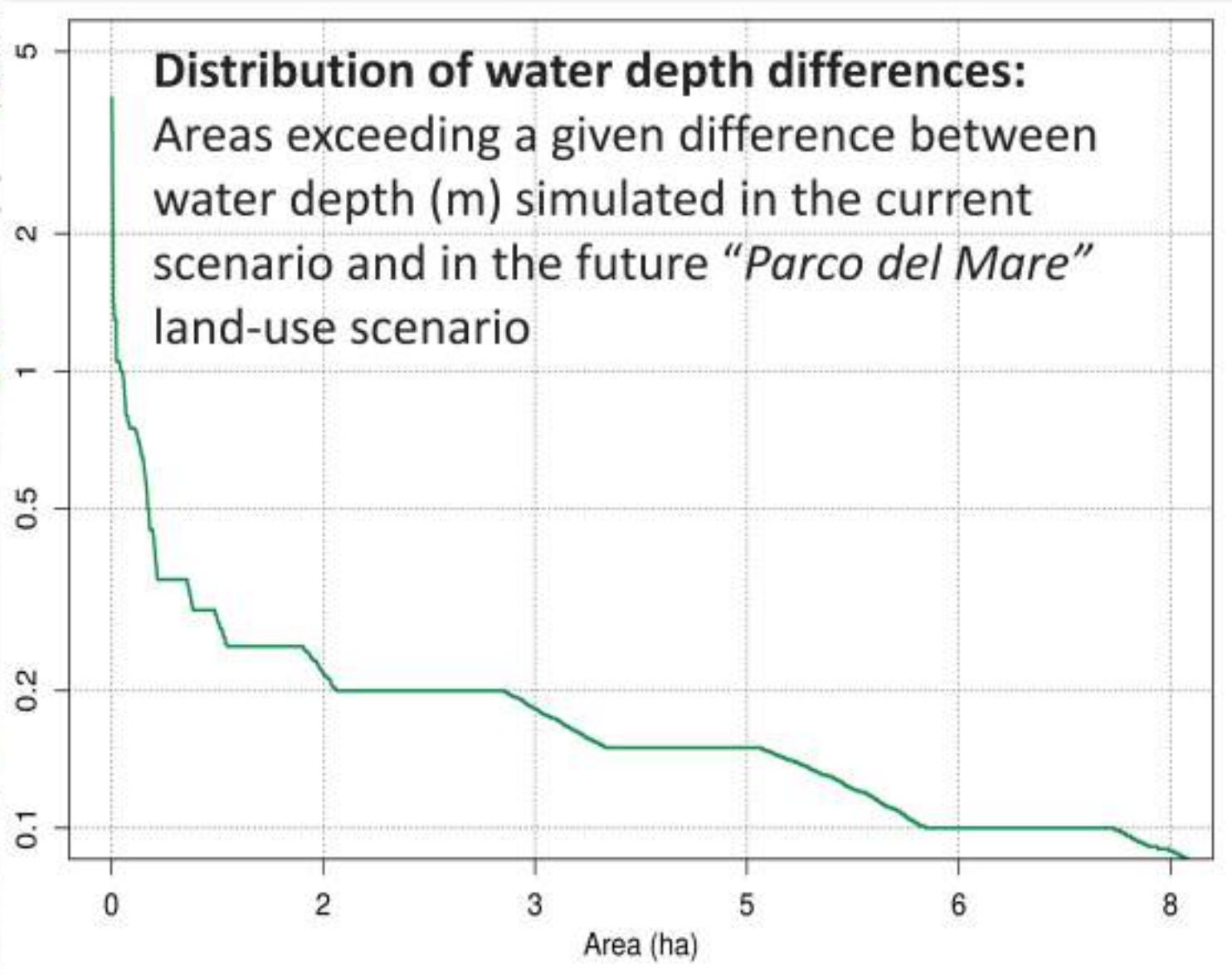
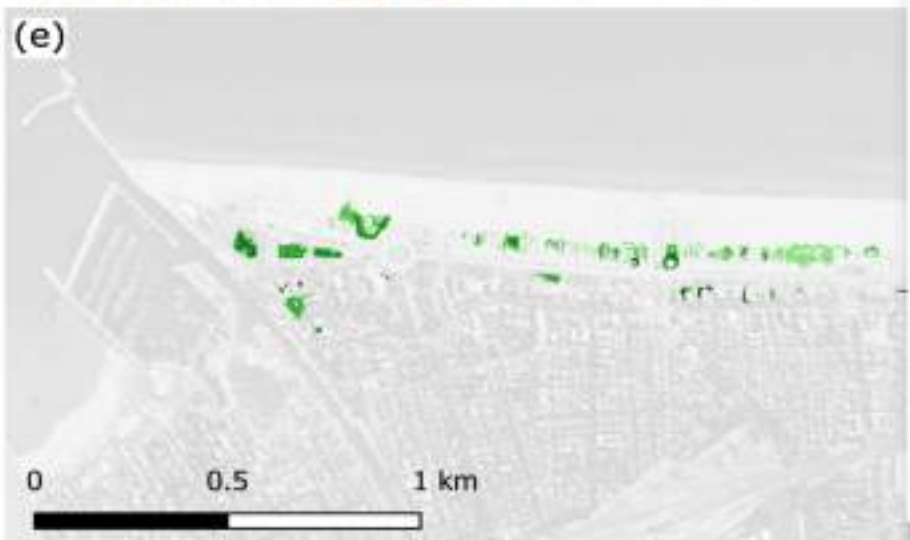
**90 mm 1-h rainfall event:**

(c) water depth for the 1h rainfall event and the *Parco del Mare* land-use scenario (urban green-infrastructure, left) and differences in water depth compared to the current layout (right);

(e) water depth for the *Parco del Mare* urban green infrastructure minus the simulated water depth for the current land-use scenario



# Rimini: pluvial flooding scenarios





# SaferPlaces: web-based climate service

The beta version of the SaferPlaces Platform, a cloud web-service for cost-effective mapping of flood hazard and risk in urban areas, is now accessible online for everyone. You can test it directly at this link:

[platform.saferplaces.co](https://saferplaces.co/platform.saferplaces.co)

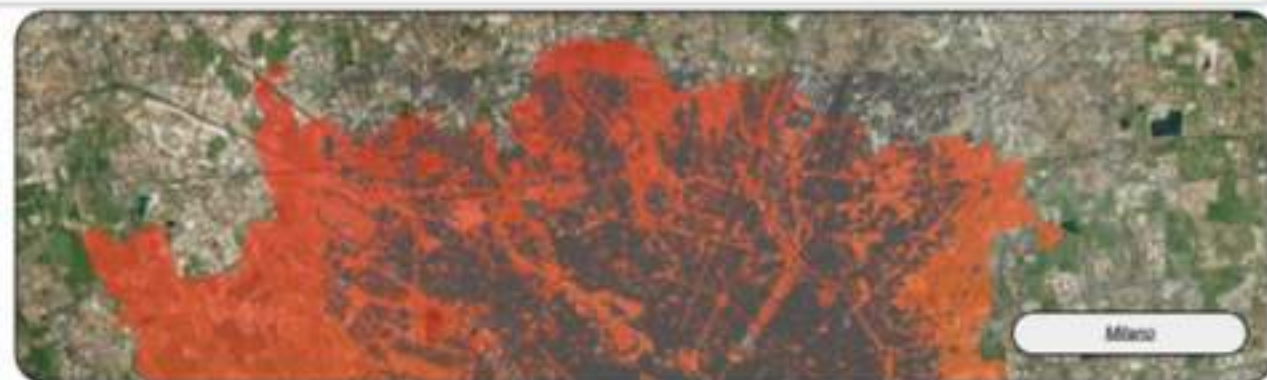
Video tutorial: <https://youtu.be/xvqjLTHJc5A>



<https://saferplaces.co/>



## SaferPlaces





# Discussion and Outlook

## Main Limitations

- Flooding dynamics is not modelled: underestimation of maximum water levels, no indication on timing, **nor velocity**

## Main advantages and ideal applications

- Terrain pre-processing is run once and it fully characterizes the hierarchy for filling and spilling processes (**very fast computation of flooded areas**)
- Straightforward application to spatially variable precipitation and infiltration losses
- Identification of pluvial-hazard hotspots
- Optimal location of detention tanks/ponds
- Pluvial flooding scenarios for e.g. evacuation plans

## Recent features

- Spatially variable precipitation (e.g. **weather radar**)
- Spatially variable losses (capacity of storm water drainage systems, variable land-cover and infiltration rates)



Example for a 982 by 1068 grid on a 2 CPU's,  
Intel(R) Xeon(R) CPU @ 2.30GHz, cache: 46080 KB

**Preprocessing time**  
**Computation of**

- **10.9s** for a cur
- **9.2s** for a cur



**Lignano, Sept. 11, 2017 rainstorm**  
**Cumulative rainfall depth 280 mm,**  
**120 mm in 4 hours, 55 mm in 1 hour**





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