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# A GIS-based urban and peri-urban landscape representation toolbox for hydrological distributed modeling





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# ABSTRACT

Flowpaths are significantly affected by land use change and engineered elements across urban catchments. Conventional GIS-based tools for extracting drainage networks were not developed for urban terrains. This work presents Geo-PUMMA, a GIS toolbox to generate vectorial meshes for terrain representation in distributed hydrological modeling, and to extract drainage patterns in urban and periurban catchments. Geo-PUMMA generates well-shaped Hydrological Response Units (HRUs) and Urban Hydrological Elements (UHEs). The toolbox was used in peri-urban catchments of Chile and France to generate three model meshes with different levels of treatment, and extract and compare their corresponding drainage networks. A recommended mesh is identified, which replicates the main morphological and hydrological features of the reference drainage network, and is able to preserve features at small to medium spatial scales (~80–150 m). Overall Geo-PUMMA can be used to represent the terrain in distributed hydrological modeling applied to urban and peri-urban scales.

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#### Software availability

#### Availability: https://forge.irstea.fr/projects/geopumma

Additional technical documentation: A user manual with an example database available from the same web address. Year First Available: 2016

Hardware Required: Desktop/Laptop with 2 GHz CPU, 4 GB RAM or more

Operating System Required: Ubuntu 14 (64b) or newer

Software required: Geo-MHYDAS, GRASS GIS 6.4, QGIS 2.12. These software and other plugins and libraries are packaged in a Virtual Box Machine available from the same web address Cost: Free Program Language: Python License: GNU General Public License

Geo-PUMMA was developed in GRASS 6.4 in a virtual machine with Ubuntu 14 (64b). Although programming skills are not needed, Geo-PUMMA requires some knowledge on spatial analysis and hydrological modeling. It is necessary to be familiar with the use of commands and to have basic knowledge of urban hydrology that allow making decisions when representing urban features.

### 1. Introduction

Urban development significantly changes the hydrogeomorphology of natural river catchments and their drainage networks (Booth and Henshaw, 2001; Booth and Fischenich, 2015;

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Vietz et al., 2015). Some of the most impacted areas are located in so-called peri-urban catchments, where urban development is often ongoing, and natural, rural and urban areas coexist (Santo Domingo et al., 2010). Peri-urban catchments are particularly vulnerable to environmental change with urban development drastically modifying the landscape (Lee and Heaney, 2003; Shuster et al., 2005) and changing the connectivity of surface and subsurface flowpaths (Braud et al., 2013b). Thus, the accurate characterization and representation for modeling purpose of these catchments becomes essential.

The representation of surface flowpaths at small scales is critical in hydrological modeling of urban and peri-urban areas. Such representation must consider not only channelized elements, but also the connectivity of impervious and pervious surfaces (Sanzana et al., 2013; Rossel et al., 2014). In small catchments, surface routing is sensitive to the presence of relatively small channels, which can be highly responsive to intense and short rainfall events (Singh, 1995). Moreover, Rossel et al. (2014) showed that the connectivity among pervious and impervious areas affects the magnitude and relative contribution of the different mechanisms that ultimately influence the overall catchment response. Finally, Jankowfsky (2011) showed how the use of inappropriate polygon meshes to represent the terrain affects the correct connectivity of hydrological elements.

Several GIS tools have been developed to represent and visualize landscapes and extract information for hydrological modeling. Classical methodologies of drainage extraction and catchment delineation use Digital Elevation Models (DEM) and raster-based flow direction algorithms, such as the D8 (O'Callaghan and Mark, 1984) or Multiple Flow Directions (MFD) algorithm (Holmgren, 1994; Toma et al., 2001; Seibert and McGlynn, 2007). Furthermore, mathematical filters can be used with high-resolution DEM to detect curvatures and slope directions, and define valleys and likely channelized locations in the catchment (Lashermes et al., 2007; Passalacqua et al., 2010; Sangireddy et al., 2016). These algorithms only extract well-defined streams and work fine in natural and non-flat areas at regional or medium scales (~100–1000 km<sup>2</sup>), but tend to fail at smaller scales associated with urban and peri-urban areas and catchments (<0.1–10 km<sup>2</sup>), where surface and subsurface infrastructures can modify dramatically flow paths and catchments' boundaries (Gironás et al., 2010b; Jankowfsky et al., 2013; Rodriguez et al., 2013). These tools represent the terrain using cells of the same shape and size (e.g. square grid cells), but other non-uniform meshes composed of triangles or polygons can also be used to avoid the oversimplification of interfaces between hydrological elements, while reducing as much as possible the number of elements in the final model mesh.

Good examples of GIS tools on raster-based are GRASS-HRU (Schwartze, 2008), WINHRU (Viviroli et al., 2009) and GRIDMATH (Viviroli et al., 2009), and vector-based are AVSWAT (Di Luzio et al., 2004), and PIHMgis (Bhatt et al., 2014). These tools use Hydrological Response Units (HRUs) as elementary units, but they were developed to represent medium and regional scale areas, so urban and peri-urban elements are normally not well captured. Tanato2 (Bocher and Martin, 2012) is a GIS tool that uses Triangular Irregular Networks (TINs) to represent complex urban and peri-urban terrains and their special features and elements, as well as the interface between hydrological elements. Nonetheless, the final mesh is composed only of triangles, and thus has notably more elements than irregular meshes. Geo-MHYDAS (Lagacherie et al., 2010), a tool that uses meshes conformed by irregular shape polygons developed for agricultural areas, is not suitable for representing urban elements either, as it cannot deal with topological problems typically found in urban terrain meshes (e.g., non-convex polygons, complex boundary interfaces and large polygons).

Despite the afore mentioned advances in terrain representation for hydrological modeling, the extraction of flow paths and the hydrological analysis of urban and peri-urban environments handling man-made hydraulic features (e.g., ditches, channels and pipes) is still an open scientific question. To the best of our knowledge, no specific tool is available yet to generate good quality polygonal meshes for urban and peri-urban catchment, i.e. a mesh composed of the least possible number of properly interconnected well-shaped elements. A well-shaped element is a not-so-thinand-slim pseudo-convex polygon hydrologically homogenous, which allows the identification of the hydrologic connectivity defined by the terrain, and ensure the efficient application of hydrological models.

The objective of the paper is to present and illustrate the use of Geo-PUMMA, a GIS tool to generate polygonal meshes for urban and peri-urban terrain representation, from which a spatial characterization of the hydrological attributes, as well as an accurate connectivity for distributed hydrological modeling, are obtained. After describing its structure and main components, we illustrate an application of Geo-PUMMA for hydro-geomorphological characterization of peri-urban catchments, with a particular focus on their drainage network and its representation with different mesh alternatives whose quality are assessed using geometrical and hydrological descriptors. Generally, the expression "drainage network" refers to the network of pipes and streams conveying flow to the outlet. In this paper, this concept refers to the whole connectivity structure among the hydrological elements within the catchment contributing to the channelized system (streams, ditches and sewer). Two catchments located in different landscapes and climatic conditions were chosen: the Estero El Guindo catchment (Santiago, Chile), and the Mercier catchment (Lyon, France).

#### 2. Geo-PUMMA

#### 2.1. General presentation of Geo-PUMMA

Geo-PUMMA is a semi-automatic toolbox to spatially represent urban and peri-urban catchments and the explicit hydrological connectivity among their components, for the subsequent implementation of semi-distributed and distributed hydrological modeling. It uses a vectorial approach to produce irregular shape elements that are representative of the principal physiographic units of small catchments (0.1–10 km<sup>2</sup>). Geo-PUMMA can explicitly consider not only natural features, but also artificial infrastructures implemented in urban and peri-urban environments (e.g., hydraulic infrastructure, detention and retention devices, pipes and streets). Urban features are represented using Urban Hydrological Elements (UHEs) (Rodriguez et al., 2008), while natural/rural areas are depicted using Hydrological Response Units (HRUs) (Flügel, 1995). These units are represented using varying-size, irregular shape polygons.

Geo-PUMMA builds upon the tools initially developed to process geospatial information and represent peri-urban terrain in the hydrological model PUMMA (Jankowfsky et al., 2014). This development is reported elsewhere in the literature (i.e., Paillé, 2010; Brossard, 2011; Jankowfsky, 2011; Sanzana et al., 2013). These tools were developed using different computer languages and software (i.e. SQL, R scripts and GRASS functions). Geo-PUMMA not only consolidates these tools in order to simplify their use and the data processing, but also includes new functionalities. Geo-PUMMA is implemented on the GRASS platform (GRASS Development Team, 2015) and QGIS (Quantum GIS Development Team, 2015), and the corresponding codes are written in Python programming language (python.org) due to the advantages of topological management and available commands to process vector grids.

Geo-PUMMA considers four main steps covering the whole analysis process going from data gathering and digitalization up to the derivation of the hydrological connectivity. The first step (Step A) corresponds to data collection, digitalization and quality improvement of all the geospatial maps relevant for the modeling of urban and peri-urban hydrologic processes. The second step (Step B.1) corresponds to the description of the urban area, in which all the UHEs are delineated and characterized using attributes such as average height, area, percentage of imperviousness, green area, and distance from the centroid to the closest sewer or street. In the third step (Step B.2) the initial HRUs segmentation is improved using triangulation and dissolution processes based on the socalled geometric indexes. In this step HRUs can also be segmented to lump the topographic properties obtained from the DEM (Sanzana et al., 2013), including the slope, aspect, etc. In the fourth step (Step B.3), the drainage network is extracted using a recursive algorithm for identifying surface and sub-surface flow directions, and considering hydrological connections among the different units. The obtained drainage network is composed of the channelized infrastructure, natural streams and the entire connectivity among the HRUs and UHEs draining to the channelized system (streams, ditches and pipes). A final step not performed by Geo-PUMMA is needed to transform the geospatial features into database tables to be processed by the hydrological model. For example, in the case of the PUMMA model (Jankowfsky, 2011; Fuamba et al., 2015), this step uses SQL scripts developed by Jankowfsky (2011). The resulting features can also be used in other models such as SWMM (Gironás et al., 2010a), SWAT (Neitsch et al., 2005). URBS (Rodriguez et al., 2008) or MHYDAS (Moussa et al., 2002). Table 1 summarizes the different scripts implemented in Geo-PUMMA, which can be of optional or compulsory use. The Geo-PUMMA Tutorial (Geo-PUMMA Team, 2017) provides details and an example on how to use these scripts, that will give the user an idea of the computing times involved.

Although Geo-PUMMA is a self-contained tool including the scripts developed to implement this 4 step methodology, certain GRASS and Geo-MHYDAS scripts (Lagacherie et al., 2010) are needed for some specific steps, and should be installed together with Geo-PUMMA (Appendix 1 presents the main functions used in

addition to Geo-PUMMA). From now on in the text, *m. script* and *v. function* correspond to external Geo-MHYDAS scripts and GRASS functions respectively. Readers are referred to the GRASS (GRASS Development Team, 2015) and Geo-MHYDAS (Lagacherie et al., 2010; Fabre et al., 2010) documentation to learn about the use and implementation of these scripts. Nonetheless, a Virtual Box Machine with all the tools and external scripts is available from the Geo-PUMMA downloading site. More details and examples are available in the Geo-PUMMA Tutorial. What follows is a description of the four steps considered in Geo-PUMMA.

#### 2.2. Step A: data collection and maps digitalization

The aim of Step A is to collect and pre-process all the relevant maps containing spatial information, including urban cadastral maps, land use maps, vegetation, soil type and geology layers, as well as natural and urban channelized networks (Fig. 1). The preprocessing allows generating maps with clean topology to be used in the next steps. In addition to digitalized private and public lots, the cadastral maps should include public built areas (e.g., streets, squares and parks, sport and recreation areas, trails and bike paths). Certain infrastructures can be digitalized from highresolution aerial photos, LiDAR (Light Detection and Ranging) images or similar, with resolutions finer than 0.5 m. Much of this information is available on-line, but some is found in urban data banks prepared and maintained by municipalities and public or private institutions. Green and natural areas as well as crops can be identified from satellite information and manually digitalized (Banzhaf et al., 2013; Jacqueminet et al., 2013). Finally, minor hydraulic infrastructure such as diversion elements, culverts and drains can be identified from field surveys.

Although most of the algorithms developed for remote sensing images consider a raster format, the resulting maps are vector layers (i.e., polygons, polylines). As expected, the quality of these maps and the subsequent computation of lumped properties such as height, slope and aspect, depend strongly on the resolution of the original DEM.

Once the basic polygonal layers have been collected, we recommend correcting linear elements such as rivers to avoid

#### Table 1

Tasks in each step of Geo-PUMMA and the corresponding scripts.

	Script/Plugin	Task (optional/compulsory)				
Step A p. clean_topology.py		Cleaning topological polygons (compulsory)				
	p. clean_polyline.py	Snapping, breaking and joining polylines (optional)				
Step	p.sidewalk_street.py	Segmenting part of sidewalk and street in front of each urban lot (compulsory)				
B.1	p.uhe.py	Creating the UHE shapefile (compulsory)				
	p.a.average_altitude.py	Getting the mean altitude and statistical parameters of each UHE (compulsory)				
	p c.wood_surface.py	Getting the green area percentage of each UHE (optional)				
	p.length.py	Getting the distance from the centroid to the street centerline (compulsory)				
	p.built.py	Getting the building percentage of each UHE (optional)				
Step	p.polygons_holes.py	Segmenting the HRU with island inside (optional)				
B.2	p.shape_factors.py	Calculating shape factors (convexity index, solidity index, form factor and compactness) (compulsory)				
	Triangle Plugin	Segmenting the bad-shaped HRU using library Meshpy and Software Triangle implemented in QGIS (compulsory)				
	p.convexity.py	Dissolving using convexity and area criterion recommended for highly non-convex polygons (compulsory)				
	p.formfactor.py	Dissolving using form factor and area criterion, recommended for thin and needle-shaped polygons such as streets (compulsory)				
	p.raster_segmentation.py	Segmenting units with high variability of a given property from raster information (optional)				
Step	p.all_interfaces.py	Identifying all the interfaces between polygons and/or linear features (WTI and WTRI) (compulsory)				
B.3	p.river_segm.py	Segmenting the river considering the WTI and WTRI elements (compulsory)				
	p.wtri.py	Identifying all interfaces between HRU/river and UHE/river (compulsory)				
	p.wti.py	Identifying all interfaces between HRU/UHE (compulsory)				
	p.olaf.py	Extracting the drainage network considering overland flow, natural streams and channelized infrastructures (compulsory)				
	p.geo_descriptors.py	Updating the database from the model mesh, considering the update of distance and cumulative area as input for computing width				
		and area functions (compulsory)				
	p.river_direction.py	Changing all directions of the river's segments considering upstream $(-1)$ or downstream $(1)$ direction (optional)				
	p.rebuild_ditch_segments.py	Dissolving all river segments, allows simplifying the number of final segments, keeping their properties uniform (optional)				
	p.river_h_s.py	Getting the altitude and slope of each river segment (compulsory)				



Fig. 1. Tasks and output maps associated with Step A, digitalization and pre-processing of input information.

topological mistakes in the intersection step (Fig. 2a), in which all the polygon or polyline layers are overlapped. Thus, the channelized network must be adjusted to one side of the street or to the closest edge elements to avoid the creation of small irrelevant units for hydrological modeling (Fig. 2b). Additionally, at this step the edges of the lower resolution maps (e.g., soil type and geology) must be adjusted to those with higher resolution (i.e., cadastral maps). Linear elements can only be adjusted manually in a very time consuming manner given the length of channelized networks. Nevertheless, as such correction is not included in Geo-PUMMA, we recommend using a semi-automatic snapping tool such as the *m. snaplp* script, which allows snapping automatically the vertex of the polyline to the nearest element (Fig. 2c).

The next step is the delineation of the catchment and subcatchment boundaries using all the available related maps (e.g., land use, sub-catchments, soil and geology). If a single stream network exists, the delineation based on the DEM can be a first approximation, and drainage infrastructures (e.g., sewers and ditches) can be used later to refine the boundaries. In fact, stormwater or combined sewer networks can hinder the delineation and definition of urban sub-catchments, and field surveys become crucial to achieve this task (Jankowfsky et al., 2013). Finally, the limits of each of the input maps must coincide exactly to generate the initial overlapped map. Each shapefile must be imported into a GRASS database using *p. clean\_topology.py* and *p. clean\_polyline.py* to avoid topological problems in polygonal and polylines features respectively.

#### 2.3. Step B.1: delineation and characterization of UHEs

To create the UHEs, urban lots, land plots and streets are first extracted from the land-use layer (Fig. 3, step B.1) in which all the built elements are digitalized. A relevant input for the definition of the UHEs is the polyline representing the axis of every street, from which the distance to each UHE is computed. Because no specific script is available in Geo-PUMMA, these street axes must be obtained from public or private database, or digitalized from the urban street layer either manually or using computer-assisted tools



**Fig. 2.** Correction of linear elements to avoid topological mistakes when intersecting different maps. (a) a particular urban location containing polygons from the initial mesh (white polygons) and a digitalized storm sewer (blue polyline). (b) a sliver area (red polygon) is created when intersecting the storm sewer and the initial mesh, which can be removed by snapping the polyline to the nearest polygon boundary (yellow line). (c) After the correction, the storm sewer overlaps the polygon boundary. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)



Fig. 3. Flowcharts showing Step B.1 (UHE characterization), Step B.2 (HRU characterization) and Step B.3 (Hydrological connectivity description).

proposed elsewhere (Hu et al., 2004; Haunert and Sester, 2008; Leninisha and Vani, 2015). Only scripts from Geo-PUMMA are needed to create the UHEs, and no extra tool is required. The *p. sidewalk\_street.py* script generates the sidewalk and street layer, and identifies the sidewalk and half of the street in front of each lot. This layer and the cadastral map are used by the *p. uhe.py* script to create the UHEs (see an example of final UHEs in Fig. 4). Different scripts are then used to assign different attributes to each UHE, including: average height (*p.average\_altitude.py*), distance from the centroid to the center of the street (*p.length.py*), built area in each lot (*p.built.py*), and the fraction of trees by lot (*p.wood\_surfaces.py*) in case a detailed digitalization of each lot is available. Alternatively, Banzhaf et al. (2013) propose digitalizing the green areas of a random representative set of lots to build a simple statistical relationship between the lot area and the percentage of green area.

# 2.4. Step B.2: segmentation of HRUs

#### 2.4.1. Initial HRUs

The first step to obtain the initial HRUs is to intersect the main vector layers selected in Step A, excluding the UHEs. Usually, the tools to intersect layers in GIS platforms only operate with polygon

# a) Aerial Photography b) Lot+Sidewalk+Middle of Street c) Urban Hydrological Elements



Fig. 4. Example of UHEs generation in Geo-PUMMA. (a) Aerial Photography; (b) Lot + Sidewalk + Middle of street in front of each lot, and (c) final UHEs map.

layers (e.g. land use, sub-catchments, soil, and geology), but cannot intersect polygons with polylines (e.g. rivers and channels). Such capability is very relevant for peri-urban catchments. Thus, we propose using the script *m. seg*, although polygons features could also be intersected first, and subsequently the polylines features could be manually used to cut the polygons they intersect. Subsequently, the scripts *m. dispolygseg* and *m. sliverpolygseg* should be used to clean the resulting layers; *m. dispolygseg* dissolves the smallest areas to a certain threshold value, whereas *m. sliverpolygseg* dissolves areas with an elongated thin shape. One could also consider using the GRASS function *v. clean*, although it dissolves all the longest boundaries of the units below an area threshold.

The direct intersection of maps allows the identification of areas with homogeneous properties, although the initial mesh is composed of elements of very irregular geometry. As the distances between the centroid of the polygons are commonly used to represent the mean flow distance among units, bad-shaped elements must be corrected to avoid affecting hydrologic simulation. We define a good quality polygonal mesh for urban and peri-urban catchments as a mesh composed of the least possible number of properly interconnected well-shaped elements, with homogenous hydrological properties, that are representative of the terrain and ensure the efficient application of hydrological models. Hence, the following criteria must be satisfied (Sanzana et al., 2013): (1) the centroid must be inside each element, (2) the boundaries must be smooth, (3) the area of each element must be in a certain range, and (4) narrow and elongated elements must be avoided. In the following subsections, we present the process to correct the badshaped elements.

#### 2.4.2. Identification of bad-shaped HRUs

Bad-shaped elements can be identified after using the script *p*. *shapefactors.py*, which computes for each HRU the geometric indexes Convexity Index ( $CI = A_c/A$ ) and Form Factor ( $FF = 16 \ A/P^2$ ), where *A* is the area of the polygon,  $A_c$  is the convex area and *P* is the perimeter of the polygon. *CI* allows identifying HRUs with irregular shape in which the centroid is generally outside, whereas *FF* allows identifying thin and long units. CI = 1 for regular shape polygons such as circles, squares and rectangles, whereas CI < 1 for any non-convex units. On the other hand, FF = 1 for square polygons, and FF < 1 for thin and long units. Finally, elements with a large area must be partitioned into new smaller areas.

A good quality mesh will be composed of well-shaped elements whose areas range between a minimum and maximum value ( $A_{min}$  and  $A_{max}$  respectively), and for which *CI* and *FF* are larger than certain threshold values *CI\_min* and *FF\_min*. First, the small elements with no relevant physical significance must be dissolved by means of the *m. dispolygseg* or *v. clean* scripts. A threshold area of  $A_{min} = 10 \text{ m}^2$  is recommended for peri-urban landscapes. Subsequently, elements with area larger than  $A_{max}$  must also be identified and segmented. A value  $A_{max} = 2$  ha is recommended for peri-urban areas. Second, elements with *FF* < *FF\_min* (i.e. narrow and thin units) and elements with *CI* < *CI\_min* are identified.

As a result, three independent bad-shaped subsets associated with the geometric or area criteria are generated. The subset with small polygons ( $A < A_{min}$ ) must be dissolved and is not considered in the segmentation procedure. Because the bad-shaped units will be triangulated to avoid increasing the processing times, the user must verify that the number of vertexes of each subset does not exceed a certain value using the *v. info* script. We suggest a maximum of 500 vertexes/ha to represent spatial features such as green areas. Nevertheless, the function *v. generalize* can be used to simplify those elements in GRASS, with its option for reducing the

number of vertexes in a boundary using either the Douglas-Peucker (Douglas and Peucker, 1973) or Snakes (Kass et al., 1988) algorithm.

# 2.4.3. Improvement of bad-shaped HRUs

To improve bad-shaped units Geo-PUMMA uses a divide and conquer approach, in which the bad-shaped HRUs are segmented into a subset of triangles using the software Triangle (Shewchuck, 1996) prior to grouping new well-shaped units. Two options are considered for triangulation: (1) R scripts developed by Sanzana et al. (2013) to compile Triangle, or (2) the Triangle Plugin available in QGIS, which uses the Meshpy library to perform a triangulation over the shapefiles. Finally, the triangulated subset obtained using the convexity criteria ( $CI > CI_{min}$ ) is dissolved utilizing the *p*. convexity.py script, whereas the p. formfactor.py script is used for the subset obtained using the form factor criteria ( $FF > FF_{min}$ ). The divide and conquer algorithm allows the segmentation using not only a convexity criterion already presented in Sanzana et al. (2013), but alternatively a form factor criterion developed especially for Geo-PUMMA, whose pseudo-code is presented in Appendix 2 and illustrated in Fig. 5. The urban area in Fig. 5a includes a street surrounding a square, which corresponds to a badshaped element with FF = 0.06 (Fig. 5b.1). The segmentation of this polygon considers adding vertexes every 5 m or less (Fig.5b.2), the subsequent triangulation (Fig.5b.3) and dissolving to generated 10 pieces with  $FF > FF_{min} = 0.4$  (Fig.5b.4). Finally the new mesh is composed of well-shaped and small elements (Fig. 5c).

This process produces a good quality mesh made up of wellshaped elements that still may have small area units and/or elongated triangles. A new application of the *p. shapefactors.py* routine allows identifying units with  $A < A_{max}$ ,  $CI < CI_{min}$  and  $FF < FF_{min}$ values. The iterative application of the divide and conquer approach using *CI* or *FF* criteria can produce new small bad-shape elements, as these criteria may sometimes not be compatible. Small elements without hydrological meaning are finally dissolved, whereas the others are kept in the final mesh despite not fulfilling the geometric criteria.

Fig. 6 illustrates the use of the script *p. convexity.py* in the segmentation of a bad-shaped unit. The unit (Fig. 6a) is divided in triangulated units (Fig. 6b), which are dissolved into polygons using threshold values of  $CI_{min} = 0.95$  (Fig. 6c) and  $CI_{min} = 0.85$  (Fig. 6d). Fig. 7 illustrates the use of the script *p. formfactor.py* in the segmentation of a bad-shaped unit with a thin and long shape. The thin element (Fig. 7a) is divided in triangulated units (Fig. 7b) that are dissolved into polygons using threshold values of  $FF_{min} = 0.50$  (Fig. 7c) and  $FF_{min} = 0.20$  (Fig. 7d).

#### 2.4.4. Segmentation by raster criterion

The final segmentation step using the *p. raster\_segmentation.py* routine (Sanzana et al., 2013) is applied to the HRUs with high internal variability of topographic attributes, such as slope or aspect. This script creates new more homogeneous units and facilitates the extraction of a more realistic hydrological connectivity.

# 2.5. Step B.3: hydrological connectivity

The hydrological connectivity of surface flow paths and subsurface interfaces is extracted from the improved mesh (Fig. 3, Step B.3). Routing algorithms are applied considering the centroid of the units directly connected to the drainage system. The length of the interface between adjacent units is used to estimate the lateral subsurface flow between two units (HRU or UHE) or between one unit and the river. The hydrological interfaces are identified using the *p. all\_interfaces.py* routine. Then, the initial river (Fig. 8a) is



**Fig. 5.** An example of a bad-shaped polygon improvement. (a) a long and thin street surrounding a square is generated. (b) The street corresponds to a bad-shaped polygon with FF = 0.06, which is treated to generated 10 elements with  $FF > FF_{min} = 0.4$ ). (c) Final improved mesh.



Fig. 6. HRU segmentation according to Convexity Criterion. Initial Polygon (a), Triangulated Polygon (b), Dissolved with Cl<sub>min</sub> = 0.95 (c) and Cl<sub>min</sub> = 0.85 (d).

segmented based on the boundary of the adjacent units using the *p. river\_segm.py* routine (Fig. 8b). In addition, the *p. wti.py* and *p. wtri.py* scripts are used to identify all the interfaces through which flow exchange between the river and neighboring units occurs. These interfaces are defined as WTRI (Water Table River Interfaces) and WTI (Water Table Interfaces) (Fig. 8b).

The *p. olaf.py* routing algorithm (Brossard, 2011) connects first all river segments bordering HRUs and all the isolated HRUs with only one neighbor. Then, for the remaining HRUs, it looks for the minimal height until reaching the river or channel section. As a result, a vector layer with the hydrological connectivity of the HRUs and UHEs is obtained. If a loop is generated within the process, the algorithm recursively looks for an alternative route from the unit starting the loop until reaching the drainage system (the pseudocode of the OLAF algorithm is presented in Appendix 3, its flowchart in Fig. 9 and an example of application in Fig. 10). Because the sub-catchments are delineated as an intermediate step, the search is only carried out inside each sub-catchment, and avoids leaps to neighboring catchments as the topographic boundaries previously imposed are respected. The *p. olaf.py* algorithm also delivers the HRUs subset that could not be connected to the general system. In this case, the heights must be verified and the routine run again. A manual checking and connection is eventually needed only when bad-shaped elements or big flat units produced by the previous segmentation still remain.

The *p. geo\_descriptors.py* routine can be used to perform a detailed analysis of the spatial distribution of the connected area. This routine stores the area -or any other property whose value is spatially distributed- and distance to the outlet point. This information can then be used to compute the width and area function, two geomorphological functions utilized later to characterize the drainage networks generated by Geo-PUMMA. In a final step, the direction of the drainage system can be defined from downstream or upstream with the *p. river\_direction.py* script. Furthermore, in order to minimize the number of stream reaches and reduce computation time, portions of them with similar characteristics



Fig. 7. HRU segmentation according to Form Factor Criterion. Initial Polygon (a), Triangulated Polygon (b), Dissolved with FF<sub>min</sub> = 0.50 (c) and FF<sub>min</sub> = 0.20 (d).



Fig. 8. Initial River (a) and Segmented River (b) based on HRU neighbors.

(particularly height) can be dissolved with *p. rebuild\_ditch\_segments.py*, while the height and slope are reassigned with the *p. river\_h\_py script*.

# 3. Application of Geo-PUMMA to two case studies

As an application example, Geo-PUMMA was implemented in

two peri-urban catchments located in different geographical regions, to create and geomorphologically and hydrologically compare 3 particular meshes generated by the model and the corresponding drainage networks. This application illustrates the performance and flexibility of Geo-PUMMA when used in diverse landscapes with different data availability and format, and allows recommending strategies and parameter values to obtain good-



Fig. 10. An example of the OLAF algorithm. a) Connection of neighboring river units to the river and isolated polygons with neighbor polygon, b) routing upper units into downstream unit and c) routing until connecting all units.

quality meshes. In addition, the final segmentation obtained with Geo-PUMMA is qualitatively compared against the application of a traditional raster-based approach, in order to show the advantage of the Geo-PUMMA vectorial approach. As a reference, the application of Geo-PUMMA to the study catchments here described implied computing times of ~60 h.

### 3.1. Study areas and available information

#### 3.1.1. Estero el Guindo catchment, Santiago (Chile)

The Estero El Guindo catchment (Fig. 11a) is located in the Andean foothill, in a rapidly expanding peri-urban area in the piedmont of Santiago, Chile (Romero et al., 1999, 2010; Romero and Vasquez, 2005; Pavez et al., 2010; Banzhaf et al., 2013). The catchment has an area of 6.5 km<sup>2</sup> and elevations range between 788 and 1310 m. The geology is composed of permeable layer of fluvial deposits with andesitic rocks in the impermeable bottom. There is an unconfined aquifer with shallow depths in the upper portion of the catchment and larger depths in the lowest part. The natural area is covered by native vegetation (51%) and the urban area covers the remaining 49%.

The land use map was generated using information provided by the Chilean Areal Photographical Service and the Municipal Master Plan (Municipalidad de Lo Barnechea, 2012) whereas soil types and geology information were obtained from technical studies (DGA-AC, 2000; DGA-Arrau, 2008). Contours every 1 and 2.5 m and 1:2500 and 1: 5000 maps were available from DOH-EIC (2004) for the urban and natural portions of the catchment, respectively. Finally, the channelized network was identified from field surveys, and information provided by DOH-CADE (2001) and DOH-EIC (2004).

#### 3.1.2. Mercier catchment, Lyon (France)

The Mercier catchment (Fig. 11b) is part of the Yzeron periurban watershed (150 km<sup>2</sup>) located southwest of Lyon, France. It has an area of 6.8 km<sup>2</sup> and elevations range between 300 and 785 m. The geology consists mainly of gneiss and granite, and soils are quite shallow, especially in upslope areas, leading to an overall



Fig. 11. Study areas. a) Estero el Guindo Catchment, Chile, and b) Mercier Catchment, France.

low water storage capacity. Fifty percent of its area is for agriculture, 40% is covered by forests, and 10% is either urban or impervious (Braud et al., 2013a).

The available information includes a detailed land use map obtained by manual digitalization (Jacqueminet et al., 2013), a pedology map (SIRA, 2011), a geology map (BRGM, 2011), a 2 m DEM (Sarrazin, 2012), a sub-catchment map generated using the method proposed by Jankowfsky et al. (2013), maps with ditches (Jankowfsky, 2011), and the sewer network provided by the Syndicat Intercommunal pour l'Aménagement de la Vallée de l'Yzeron.

#### 3.2. Modeling meshes and associated drainage networks

In this application, three meshes are defined:

- Initial Mesh (IniM): this mesh is obtained from intersecting the land use, soil type, sub-catchments and geology layers, but without applying step B2 on HRUs. *CI* and *FF* values for this mesh are not restricted, and thus no correction to the mesh elements is implemented.
- Reference Mesh (RefM): this mesh was created using high values of the geometric indexes, i.e.  $CI_{min} = 0.975$ ,  $FF_{min} = 0.5$ , and  $A_{max} = 2$  ha. This is the best model mesh to be obtained from the available information, which allows the best topographic fidelity while avoiding topological problems. This mesh ensures a high degree of segmentation and significantly increases the number of final elements.
- Recommended Mesh (RecM): This mesh is obtained when using the default values of  $CI_{min} = 0.75$ ,  $FF_{min} = 0.20$  and  $A_{max} = 2$  ha. This mesh is a compromise between the initial and reference meshes. It relies on *CI* and *FF* values that allow getting well-shaped elements, without significantly increasing their number.

3.3. Characterization and assessment of the meshes and drainage networks

#### 3.3.1. Width and area functions

To characterize the drainage network extracted from each mesh, we use the width function W(x) and area function A(x). W(x) corresponds to the number of drainage segments located at a given distance *x* from the catchment outlet along the drainage network, whereas A(x) is the portion of contributing area associated to this flow distance *x* (Rodriguez-Iturbe and Rinaldo, 1997). Both W(x) and A(x) allow the characterization of the arrangement of flow paths and contributing areas in the catchment, which have strong implications on its hydrologic response (Rodríguez-Iturbe and Rinaldo, 1997). Indeed, W(x) has previously been used to compare drainage network representations (Richards-Pecou, 2002; Moussa, 2008; Rodriguez et al., 2013; Sanzana et al., 2013), and to assess the effect of urbanization on the drainage network structure and potential impacts in the resulting hydrograph response (e.g., Smith et al., 2002; Gironás et al., 2009; Ogden et al., 2011).

In particular, we compare W(x) and A(x) of the IniM and RecM against the RefM to identify the locations and spatial scales at which the drainage networks associated with the different meshes differ. To assess the goodness-of-fit against the RefM, we use the Mean Absolute Error (MAE) and the Nash-Sutcliffe efficiency coefficient ( $C_{NS}$ , Nash and Sutcliffe, 1970). The MAE is a residual measure to evaluate the goodness-of-fit in the units of the variable (Bennett et al., 2013), whereas the  $C_{NS}$  is a relative error measure, which combines the correlation coefficient and observed and simulated means and standard deviations, to assess similarities in the overall function patterns (Legates and McCabe, 1999; Bennett et al., 2013). Values of  $C_{NS} < 1$  are associated with differences in the connectivity of the modeling meshes.

Because both W(x) and A(x) allow reducing the 2D drainage structure to a 1D mathematical function, they can be analyzed and compared using power spectral analysis. This analysis quantifies the distribution of power per unit frequency of discrete series, and is a useful tool to get information about their structure in the frequency domain. Such analysis has been previously applied to W(x)and/or A(x) (Rodríguez-Iturbe and Rinaldo, 1997; Veneziano et al., 2000; Richards-Pecou, 2002; Puente and Sivakumar, 2003; Moussa, 2008; Sanzana et al., 2013). For each of the three meshes, we compare the cross power spectral density (CPSD) of W(x) (and A(x)) against that of W(x) (and A(x)) of the RefM. The CPSD is the power spectral of the cross-covariance between two series (Shynk, 2012), which allows quantifying the power shared by a given frequency for the two series. Hence, it can be used to identify at which spatial scales W(x) (and A(x)) of the IniM and RecM differ from W(x)(and A(x)) of the RefM. Note that the CPSD of the same series is simply the power spectral density of the series. All the CPSD were computed using Matlab<sup>®</sup>.

#### 3.3.2. Instantaneous unit hydrograph (IUH)

The basin geomorphology has been proven to be closely linked to its hydrologic response (Rodriguez-Iturbe and Rinaldo, 1997). In particular, A(x) incorporates some essential characters of the hydrologic response because the travel time from the subareas in the catchments is related to the flow distance to be traversed. Thus, by normalizing A(x) to obtain a unit area under the curve, and defining constant overland and channelized flow velocities, the spatial scale of A(x) can be transformed into a temporal scale to generate an instantaneous unit hydrograph (IUH), i.e. the hydrologic response of the basin when represented as a linear system. This transformation has been implemented elsewhere in the literature (e.g. Rinaldo et al., 1995; Morrison and Smith, 2001; Smith et al., 2005; Gironás et al., 2009) and is proposed here to better understand the hydrologic impacts of the catchment representation using different modeling meshes computed by Geo-PUMMA. Following what is proposed by the UDFCD (2006), for Estero El Guindo we adopted a velocity  $V_{H} = 0.75$  m/s for natural hillslopes or HRU (mean slope 34%), a velocity  $V_U = 0.27 \text{ m/s}$  for urban areas or UHE (mean slope 7%) and a velocity  $V_{Ch} = 2.2 \text{ m/s}$  for the channelized network (mean slope 3%, mixed natural/concreted channel). For the Mercier we adopted values of  $V_H = 0.27$  m/s (mean slope 13%),  $V_U = 0.60$  m/s (mean slope 8%) and  $V_{Ch} = 1.85$  m/s (mean slope 9%, mostly natural channel).

#### 3.3.3. Discretization error metric

Finally, we also use the sub-basin discretization error metric  $\Delta L_s$  associated with a certain schematic representation *s* (Liu et al., 2016) to compare IniM and RecM against RefM.  $\Delta L_s$  is given by:

$$\Delta L_{\rm s} = L_{\rm o} - L_{\rm s} = \frac{\sum_{i=1}^{n} A_{io} L_{io}}{\sum_{i=1}^{n} A_{io}} - \frac{\sum_{j=1}^{m} A_{js} L_{js}}{\sum_{j=1}^{m} A_{js}}.$$
 (1)

where  $L_o$  and  $L_s$  are the area-weighted in-channel routing lengths of the reference schematic representations o and the representation s, and  $A_{io}$  ( $A_{js}$ ) is the areas contributing to the routing channel i (j) of representation o (s), whose length is  $L_{io}$  ( $L_{js}$ ). Although originally proposed for channelized network, this error metric can be used with meshes in which the different subareas have their corresponding drainage segment. Note that  $\Delta L_s$  is a priori discretization error metric to estimate the hydrologic information loss by any discretization scheme as compared to a reference discretization (Liu et al., 2016). Hence, this metric complements the computation and analysis of the IUH in quantifying the hydrologic impact of different terrain representations without running a comprehensive hydrologic model.

#### 4. Results and discussion

# 4.1. Main characteristics of the various modeling meshes

Fig. 12 shows the three meshes generated for the Estero El Guindo catchment (Fig. 12a) and Mercier catchment (Fig. 12b). Grev lines represent the initial polygon segmentation (IniM), red lines the recommended mesh (RecM), and black lines the reference mesh (RefM). The corresponding drainage networks of El Guindo and Mercier are presented in Fig. 13. For each mesh, the drainage density  $(D_d)$ , defined as the ratio between the total length of the drainage network and the total area of the catchment, was computed (Table 2). For the Estero El Guindo, the segmentation procedure increases  $D_d$  from 24.2 km/km<sup>2</sup> (IniM) to 32.9 km/km<sup>2</sup> (RefM), while for RecM,  $D_d = 26.2$  km/km<sup>2</sup>. For the Mercier catchment, the segmentation procedure increases the drainage density from 23.6 km/km<sup>2</sup> (IniM) to 31.6 km/km<sup>2</sup> (RefM), while for RecM,  $D_d = 26.4 \text{ km/km}^2$ . In both cases,  $D_d$  of the RecM increases by ~10% as compared to the IniM. This increase is ~30% for the highly detailed segmentation of the referenced mesh. Thus, RefM improves the representation of flow paths without increasing significantly the drainage density of the initial mesh. The segmentation procedure increases the drainage density of both catchments as the final number of hydrological response units also grows up. In addition, the increase of hydrological connectivity allows avoiding topological problems in the drainage network, due to the improvement of the flow paths representation.

Table 2 summarizes the main characteristics of the HRUs for each mesh, including their number, minimum, maximum and average areas ( $A_{min}$ ,  $A_{max}$ ,  $A_{ave}$ ), and the number of well-shaped



Fig. 12. Modeling meshes for El Guindo (a) and Mercier (b) catchments: Initial (grey), Recommended (red), and Reference (black) segmentation units are identified. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)



Fig. 13. Initial (a), recommended (b), and reference (c) drainage networks of el Guindo. Initial (d), recommended (e), and reference (f) drainage networks of Mercier.

 Table 2

 Main characteristics of the Initial Mesh (IniM), Recommended Mesh (RecM) and Reference Meshe (RefM) obtained for the Mercier and El Guindo Catchments.

Mesh	D <sub>d</sub> (km/km <sup>2</sup> )	HRU	$A_{min} (m^2)$	$A_{max} (m^2)$	$A_{ave} (m^2)$	HRU <sub>FF&gt;0.2</sub>	HRU <sub>CI&gt;0.75</sub>
IniM El Guindo	24.2	2057	0.1	243,133	2119	767 (83.8%)	737 (80.5%)
RecM El Guindo	26.2	2016	10	38,663	1862	1270 (94.9%)	1145 (85.5%)
RefM El Guindo	32.9	3749	10	29,466	1427	2370 (98.4%)	2229 (92.6%)
IniM Mercier	23.6	915	2.0	192,144	3118	1644 (79.9%)	2037 (99.0%)
RecM Mercier	26.4	1338	10	20,275	2354	1849 (91.7%)	1998 (99.1%)
RefM Mercier	31.6	2408	10	19,337	1811	3480 (92.8%)	3745 (99.8%)

HRUs for which  $CI_{min} > 0.75$  and  $FF_{min} > 0.20$  (i.e.  $HRU_{FF>0.2}$  and HRU<sub>CI>0.75</sub>). Furthermore, regardless of the mesh, there are 2169 UHEs for El Guindo catchment and 290 for the Mercier catchment. The UHEs are considered as well-shaped elements, so they are preserved in all meshes. The segmentation of non-convex, thin and very large HRUs produces meshes RecM and RefM that are more homogeneous than IniM, as reflected by the increase in HRU<sub>FF>0.2</sub> and HRU<sub>CI>0.75</sub>. Although in some cases the initial percentage of well-shaped elements is high (e.g., IniM Mercier  $HRU_{CI>0.75} = 99\%$ ), they can be relevant in terms of area, so they must be included and improved to avoid connectivity distortions in the drainage networks. Such improvement ensures a more representative overland flow connectivity. For example, the segmentation removes long streets acting like walls that artificially interfere the flow routing (Jankowfsky, 2011). Overall, Geo-PUMMA creates a good quality mesh and a representative drainage network that can be useful for any hydrological model applied to urban and peri-urban landscapes.

#### 4.2. Assessment and comparison of drainage networks

#### 4.2.1. Width and area functions

Fig. 14 compares W(x) and A(x) of each mesh and catchment. W(x) of IniM significantly differs from that of the RefM for Estero El Guindo ( $C_{NS}$  ref-ini = 0.463 and MAE ref-ini = 6.95, Fig. 14a) and Mercier ( $C_{NS}$  ref-ini = 0.575 and MAE ref-ini = 7.41, Fig. 14b), whereas such difference is much less substantial when comparing RecM and RefM, both in Estero El Guindo ( $C_{NS \ ref-rec} = 0.901$  and MAE  $_{ref-rec} = 2.22$ , Fig. 14a) and Mercier ( $C_{NS \ ref-rec} = 0.768$  and MAE  $_{ref-rec} = 6.27$ , Fig. 14b). In the case of the Mercier catchment, W(x) of IniM and RecM considerably differ in the upper part (from x = 3500-5200 m, Fig. 14b), as the segmented HRUs are mainly located in natural sections at the foothill area of the catchment (Fig. 12b).

A(x) of the IniM differs significantly from that of the RefM both for Estero El Guindo ( $C_{NS ref-ini} = 0.080$  and MAE  $_{ref-ini} = 0.023$ , Fig. 14c) and Mercier ( $C_{NS ref-ini} = 0.313$  and MAE  $_{ref-ini} = 0.028$ , Fig. 14d). This poor representation of the reference A(x) occurs because there are large areas not segmented in the IniM that contribute directly to specific locations in the drainage network, which in turns causes major fluctuations of the IniM A(x) functions for both catchments (Fig. 14c and d). On the other hand, A(x) of RecM and RefM are more similar ( $C_{NS \ ref-rec} = 0.120$  and MAE  $_{ref-rec} = 0.017$  for El Guindo, Fig. 14c and  $C_{NS ref-rec} = 0.446$  and MAE  $_{ref-rec} = 0.023$  for Mercier, Fig. 14d). Although these  $C_{NS}$  values are not very high, the overall shape of A(x) resembles better than of the RefM, particularly as the large fluctuations previously identified for the IniM are not observed here. Note that improvements associated with the RecM in Estero El Guindo take place across different values of x, as bad-shaped elements were homogeneously located throughout the catchment. In the case of Mercier, bad-shaped elements were mostly located in the upper zone, so most of the improvements in W(x) and A(x) are observed for the largest values of x.

Fig. 15 shows the CPSD of W(x) and A(x) for both catchments.



**Fig. 14.** *W*(*x*) of El Guindo (a) and Mercier (b) catchments. *A*(*x*) of El Guindo (c) and Mercier (d) catchments. Each panel shows the results for the IniM (grey dotted line), RecM (continuous red line), and RefM (continuous black line). (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)

Here we define P<sub>RefM</sub>, RefM as the CPSD between RefM and itself, P<sub>RefM</sub>, IniM as the CPSD between RefM and IniM, and P<sub>RefM</sub>, RecM as the CPSD between RefM and RecM. The more similar to P<sub>RefM. RefM</sub> a cross-spectrum is, the more similar the corresponding W(x) or A(x)is to that of the Reference mesh. For W(x) in the Estero El Guindo (Fig. 15a), P<sub>RefM</sub>, RefM and P<sub>RefM</sub>, IniM differ at high frequencies with length scales of  $\tau_1 \approx 120$  m or less, whereas P<sub>RefM</sub>, <sub>RefM</sub> and P<sub>RefM</sub>,  $_{RecM}$  differ for length scales of  $\tau_2 \approx 60$  m or less. On the other hand, for the Mercier catchment (Fig. 15b)  $P_{\text{RefM}}$  ,  $_{\text{RefM}}$  and  $P_{\text{RefM}}$  ,  $_{\text{IniM}}$  differ at high frequencies with length scales of  $\tau_1 \approx 80$  m or less, whereas  $P_{RefM}$  ,  $_{RefM}$  and  $P_{RefM}$  ,  $_{RecM}$  differ for length scales of  $\tau_{2}$   $\approx$  60 m or less. Hence, in both catchments, the results from the CPSD analysis confirm that W(x) of the RecM is better than that of the IniM in resembling W(x) of the RefM at smaller scales. This improvement is relevant as small-scale features are fundamental in explaining the different mechanisms influencing the hydrologic response of urban catchments (Rossel et al., 2014). Moreover, previous studies concluded that high-frequency components of W(x) may be useful for classification of river network topology and regionalization of floods (Richards-Pecou, 2002; Lashermes and Foufoula-Georgiou, 2007; Moussa, 2008).

For A(x) in the Estero El Guindo (Fig. 15c),  $P_{RefM}$ ,  $_{RefM}$  and  $P_{RefM}$ ,  $_{IniM}$  also differ at high frequencies with length scales of  $\tau_1 \approx 150$  m or less, whereas  $P_{RefM}$ ,  $_{RefM}$  and  $P_{RefM}$ ,  $_{RecM}$  differ for length-scales of  $\tau_2 \approx 100$  m or less. For the Mercier catchment (Fig. 15d)  $P_{RefM}$ ,  $_{RefM}$ 

and  $P_{\text{RefM}, \text{IniM}}$  differ at high frequencies with length scales of  $\tau_1 \approx 150 \text{ m}$  or less, whereas  $P_{\text{RefM}, \text{RefM}}$  and  $P_{\text{RefM}, \text{RecM}}$  differ for length-scales of  $\tau_2 \approx 55 \text{ m}$  or less. Again, the results from the CPSD analysis show that A(x) of the RecM resembles better than of RefM at smaller scales than A(x) of IniM.

Our results reinforce the idea that the main impacts associated with different terrain representations are observed at small lengthscales, typical of residential lots and streets (Sanzana et al., 2013), and that the recommended mesh to represent the terrain is able to minimize these impacts while being efficient in terms of computing time cost. Indeed, using geometrical restrictions to generate the terrain meshes for both catchments improved the representation of the drainage network.

### 4.2.2. IUH extracted from hydrological meshes

The IUHs computed from A(x) of the different drainage networks are presented for El Guindo (Fig. 16a) and the Mercier (Fig. 16b) catchments. As expected, all the hydrographs are positively skewed, and the degree of similarity among them is much higher than for the case of A(x), regardless the drainage network from which they come. Nonetheless, for both catchments the IUH for RecM resembles much more that of the RefM than the IniM ( $C_{NS ref$ ini = 0.476 vs.  $C_{NS ref-rec} = 0.845$  for El Guindo, and  $C_{NS ref-ini} = 0.854$ vs.  $C_{NS ref-rec} = 0.959$  for Mercier), as part of the fluctuations of A(x)for IniM is transferred to the corresponding IUHs.



**Fig. 15.** CPSD of *W*(*x*) for El Guindo (a) and Mercier (b) catchments. CPSD of *A*(*x*) for El Guindo (c) and Mercier (d) catchments. Each panel shows the IniM (grey dotted line), RecM (continuous red line), and RefM (continuous black line). (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)



Fig. 16. IUH derived from IniM, RecM and RefM for El Guindo (a) and Mercier (b) catchments.

#### 4.2.3. Discretization error metric

After defining RefM as the reference schematic representation in Eq. (1), for each catchment we computed  $\Delta L_{ini}$  and  $\Delta L_{rec}$  of the IniM and RecM respectively. For the Estero El Guindo,  $\Delta L_{ini} = 140$ -57 = 83 m and  $\Delta L_{rec} = 82-57 = 26$  m, whereas for the Mercier catchment  $\Delta L_{ini} = 91-67 = 24$  m and  $\Delta L_{rec} = 77-67 = 10$  m. Hence, for both catchments the recommended mesh produces a lower discretization error metric, which is in agreement with the better resemblance with the reference IUH achieved using the recommended mesh.

# 4.3. Qualitative comparison of Geo-PUMMA with a classical raster approach

Finally, we assessed the results from Geo-PUMMA by comparing the terrain generated for both catchments with that produced by HRU-DELIN (Tilmant et al., 2015), a tool that uses the raster approach implemented in GRASS-HRU (Schwartze, 2008). The implementation of HRU-DELIN used a high resolution 2 m DEM, and considered a minimum area threshold of 10 m<sup>2</sup> for generating the HRU. For the upstream portion of El Guindo, Fig. 17a-c illustrate



**Fig. 17.** HRU generated using HRU-DELIN (raster approach) and Geo-PUMMA (vectorial approach) in El Guindo (I) and Mercier (II) catchments. Comparisons of HRU produced with both tools and the corresponding aerial photograph are presented for upstream (a, b, c, g, h, i) and downstream (d, e, f, j, k, l) portions of both catchments.

the HRU produced with HRU-DELIN, Geo-PUMMA and the corresponding aerial photograph, respectively, while Fig. 17 d-f illustrate the same for the downstream portion of the catchment. Fig. 17 g-i and Fig. 17 j-l present the same for the upstream and downstream portions of the Mercier catchment, respectively. Because it is a vectorial polygonal mesh generator, in both catchment some thin features (Fig. 17 a,g) or physical boundaries (Fig. 17 d,j) not well captured by HRU-DELIN, are preserved by Geo-PUMMA (Fig. 17 b.e and Fig. 17 h,k). Furthermore, despite the huge number of HRUs generated by HRU-DELIN for both catchments (over 30,000 units), some land use features are lost. Geo-PUMMA can represent the terrain with a much more reasonable number of HRU (~2000 HRUs) without major losses of land use features. Overall, these results show that Geo-PUMMA is an appropriate tool to represent urban and peri-urban terrains, while tools such as HRU-DELIN are more suitable for representing medium and regional scales in rural or natural catchments.

### 5. Conclusions and future work

This paper presents and describes Geo-PUMMA, a polygonal mesh generation tool for representing urban and peri-urban terrains and create the main inputs for distributed hydrological modeling. Geo-PUMMA considers the main physiographic units available in natural and urban landscapes, represented by means of Hydrological Response Units (HRUs) and Urban Hydrological Elements. The tool allows the generation of high quality polygonal meshes in which the numerous bad-shaped units, created by the initial intersection of GIS maps (land use, soil type, geology, river network), are improved. In particular, the tool succeeds in segmenting non-convex, thin and large elements and assigning more homogeneous properties to the different HRUs in the mesh. Geo-PUMMA represents urban and natural elements and extracts the hydrological interfaces and the drainage network with routing scripts. The generated vectorial mesh and corresponding databases provide useful information for any distributed hydrological model that requires a detailed representation of urban and peri-urban terrains. Geo-PUMMA is a computer-aided, semi-automatic tool, so the active involvement of the modeler is required to obtain good results.

Geo-PUMMA was applied to two peri-urban catchments located in different geographical regions (El Guindo, Chile and Mercier, France). We generated three spatial meshes with different degrees of segmentation, defined by threshold values of geometric constraints (i.e convexity index CI, form factor FF and maximum HRU area  $A_{\text{max}}$ ). The quality of the topography and drainage network representation increased with the degree of segmentation, but the computing-time grew as well. For both catchments a recommended mesh was identified, which represented the terrain well without highly increasing the number of HRUs. In addition, this mesh was demonstrated to provide a hydrologic connectivity very similar to that obtained for the most detailed possible representation. This mesh considered threshold values of CI = 0.75, FF = 0.2and  $A_{\text{max}} = 2$  ha, which are recommended for future applications of Geo-PUMMA. Overall, the application to both catchments shows the flexibility of the tool with different geographical conditions.

Other examples of decomposition of non-convex polygons into "approximately convex" elements implemented by Lien and Amato (2006) (ACD algorithm) and Liu et al. (2014) (DuDe algorithm) only consider convexity criterion strictly. It would be interesting to compare these geometrical algorithms against the one proposed in Geo-PUMMA, in order to evaluate its possibility to use other geometrical criteria. Moreover, a more detailed analysis could be performed to better assess and justify the threshold values of *CI* and *FF* here proposed, and to improve the computational complexity of

the geometrical algorithms developed in Geo-PUMMA.

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# APPENDIX 1. List of additional GRASS and Geo-MHYDAS commands

The following are the additional GRASS and Geo-MHYDAS scripts of optional or compulsory use.

### GRASS GIS commands

**v.generalize**: Vector based generalization. Used to simplify contour and vertexes necessary to represent an irregular shape unit (Optional Tool).

**v.clean**: Toolset for cleaning topology of vector map. Used to clean small areas (Optional Tool).

#### Geo-MHYDAS commands

**m.snaplp**: Adjusting geometry of linear features. Used to adjust river polyline to the closet boundaries (Optional Tool).

**m.seg**: Overlaying geographical objects. Used to create the first intersection of polygons and polylines features (Compulsory Tool).

**m.dispolygseg**: Selective dissolving small areal features. Used to dissolve areas with area lower than certain threshold (Optional Tool).

**m.sliverpolygseg**: Selective dissolving sliver areal features. Used to dissolve thin and long units (Optional Tool).

# APPENDIX 2. Form factor segmentation script (*p.form\_factor.py*)

- 1. For each polygon *P* with  $FF \leq FF_{min}$ 
  - 2. Split boundaries inserting vertex  $d_{max} = 5 \text{ m}$
  - 3. Apply Triangle
  - 4. While P has triangles not yet dissolved
    - 5. Select triangle with the largest area
    - 6. Select triangle neighbor with the largest area and create new group *P*<sup>'</sup>
      - 7. While *FF* of  $P' \ge FF_{min}$ 
        - 8. Search the neighbor triangles with the largest area
        - 9. Dissolve boundaries of this group
        - 10. Compute the FF of this new group
    - 11. end while
    - 12. Update P = P P'

```
13. - end While
```

- 14. Dissolve areas < area threshold
- 15. end For

#### APPENDIX 3. OLAF algorithm (p.olaf.py)

- 1. For each sub-catchment S
  - 2. Find isolated URH or UHE in the border (only with one neighbor)
    - 3. Connect them with nearest neighbor
  - 4. Find the URH or UHE which share a boundary with channelized system
    - 5. Connect the URH or UHE with channelized drainage
  - 6. Find the highest URH or UHE
    - Connect it with the lowest neighbor until reaching the channelized system
      - 8. If it does not reach the channelized drainage
        - Go back one neighbor element upstream
           Connect it whit the second lowest neighbor
      - 11. If there is a loop
        - 12. Go back to the unit upstream the loop
        - 13. Connect it with the second lowest neighbor
- 14. Collect all the OLAF path-ways

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