

Land use and water quality in watersheds in the State of São Paulo, based on GIS and SWAT data

ARTICLES doi:10.4136/ambi-agua.2325

Received: 05 Sep. 2018; Accepted: 02 Jul. 2019

Denise Piccirillo Barbosa da Veiga^{1*}^(D); Manuel Enrique Gamero Guandique²^(D); Adelaide Cassia Nardocci¹^(D)

¹Departamento de Saúde Ambiental. Faculdade de Saúde Pública da Universidade de São Paulo (FSP/USP), Avenida Doutor Arnaldo, 715, CEP 01246-904, Cerqueira Cesar, SP, Brazil. E-mail: nardocci@usp.br
²Instituto de Ciência e Tecnologia. Departamento de Engenharia Ambiental. Universidade Estadual Paulista "Júlio de Mesquita Filho" (UNESP), Avenida Três de Março, 511, CEP 18087-180, Sorocaba, SP, Brazil. E-mail: enrique@sorocaba.unesp.br
*Corresponding author. E-mail: denise.veiga@usp.br

ABSTRACT

Land use influences the quality and availability of water resources, but Brazil has made little progress in integrated watershed management. This study therefore applied geoprocessing for land-use classification and evaluated the impact on the hydrological balance in order to contribute to the integrated management of water resources. Using GIS tools, two drainage areas from the water catchment points of two municipalities, Santa Cruz das Palmeiras and Piedade, were delimited; land-use mapping was carried out using the supervised classification method of satellite images, and the SWAT model was applied for hydrological simulation. The methods used were appropriate. The surface runoff was related to the absence of vegetation and the predominance of exposed soil. The relationship between land use/land cover and the hydrological balance was evidenced, especially the impact of agricultural activities and the lack of natural vegetation in the surface runoff.

Keywords: land use/land cover, SWAT, watersheds management.

Uso do solo e qualidade da água em bacias hidrográficas do Estado de São Paulo, utilizando GIS e SWAT

RESUMO

O uso e ocupação do solo influenciam a qualidade e a disponibilidade de água, devendo ser considerados numa gestão integrada dos recursos hídricos e no planejamento das bacias hidrográficas. Ferramentas de geoprocessamento têm sido utilizadas para classificação do uso do solo e combinadas com modelos hidrológicos para avaliação do impacto de diferentes cenários de uso no balanço hidrológico visando contribuir para uma gestão integrada dos recursos hídricos. Por meio do SIG, foram delimitadas duas áreas de drenagem dos pontos de captação de água para abastecimento dos municípios de Santa Cruz das Palmeiras e Piedade; foi realizado o mapeamento do uso do solo pelo método de classificação supervisionada de imagens de satélite e aplicado o modelo SWAT para simulação hidrológica. As ferramentas utilizadas se mostraram adequadas. O escoamento superficial esteve relacionado à ausência de vegetação e predomínio de solo exposto. Foi evidenciada relação entre o uso e ocupação do



This is an Open Access article distributed under the terms of the Creative Commons Attribution License, which permits unrestricted use, distribution, and reproduction in any medium, provided the original work is properly cited. solo e o balanço hidrológico, em especial o impacto das atividades agrícolas e da falta de vegetação natural no escoamento superficial.

Palavras-chave: bacias hidrográficas, SWAT, uso do solo.

1. INTRODUCTION

In the state of São Paulo, Brazil, water resource management came to be more participatory only in 1991, when the State Policy on Water Resources and Watershed Committees was introduced, initiating a process involving discussions among representatives of various sectors, such as sanitation, environment, and industry. Prior to that time, the energy and industrial sectors had been given priority access to water resources (Eça *et al.*, 2013; Jacobi *et al.*, 2015).

The state of São Paulo has more than 40 million inhabitants, a high (96%) degree of urbanization, and intense agro-industrial production, anchored especially in sugarcane, and involving intensive use of chemical products, factors that have exerted significant anthropogenic pressure on local water resources (SEADE, 2017). Aggravating this scenario, between the years of 2014 and 2016, the state experienced a major water crisis, with a drastic reduction in the public water supply, especially in the metropolitan area of São Paulo. In addition to generating great concern on the part of public agencies and society, that crisis had a considerable socioeconomic impact in the state (Marengo *et al.*, 2015).

According to the São Paulo State Environmental Protection Agency (CETESB, 2017), the state collected 87% of the sewage generated in 2016 and treated only 62% of that sewage, all of the remaining (untreated) sewage being released directly into bodies of water, many of which are used as reservoirs for the public water supply. The indicators showed a decrease in water quality during the rainy season of 2016, with elevated trihalomethane formation potential, as well as high levels of iron, aluminum, and manganese, together with leaching from soil during heavy precipitation events, a process that is intensified in the absence of riparian forest.

Although several studies have addressed the importance of water management in the state of São Paulo, there is still a lack of tools to facilitate integrated water management, reconciling the marked regional diversity with ecosystem protection and the interdependence between the often conflicting uses, such as public water supply, industry, agriculture, as well as the producer and receiver channels of the sewage generated in urban areas (Porto and Kelman, 2000). Therefore, the use of geographic information systems (GIS), involving geoprocessing, remote sensing, and the development of hydrological models, has been considered an important strategy, allowing not only the identification of vulnerabilities in the watersheds, but also the simulation of different scenarios of land use, application of pesticides, and even climatic events, providing support for environmental monitoring and zoning plans aimed at the preservation of water resources (Ward *et al.*, 2000; Lari *et al.*, 2014; Taylor *et al.*, 2016).

The influence of land use on surface water quality has been widely studied in northern hemisphere countries (Lalancette *et al.*, 2014; Zhou *et al.*, 2016; Salmoral *et al.*, 2017), although not in countries in tropical or subtropical regions, such as Brazil. Through searches of the Scopus database, we found that, among studies using the Soil and Water Assessment Tool (SWAT) in the 2014-2018 period, only 34 had been conducted in Brazil, whereas 523 had been conducted in the United States. The majority of studies using the SWAT model for environmental analyses in Brazil have focused on watersheds in the southern or southeastern parts of the Atlantic Forest biome and have presented results indicating that the hydrological dynamics are linked to changes in land use/land cover (LULC); that type of analysis is often prioritized due to the scarcity of observed watershed monitoring data (Bressiani *et al.*, 2015).

Changes in LULC and management not only affect the vegetation cover but can also degrade the quality of the soil and of water resources (Smith *et al.*, 2016). The quality and quantity of surface waters are directly related to economic activities in the watershed and the



level of preservation. Watersheds that have riparian forests along their riverbanks and preserved areas of natural vegetation have better water quality than do those in which there is intensive agricultural activity and degraded areas (Connolly *et al.*, 2015). Therefore, this study evaluated the use of image processing for LULC classification in two watersheds for public water supply in the state of São Paulo, in which there is intensive agricultural activity of various patterns, as well as to evaluate the impact of land use on the water balance in these watersheds, through the use of the SWAT model, with the ultimate goal of contributing to the integrated management of the quality of the water resources destined for public supply.

2. MATERIALS AND METHODS

2.1. Description of the watersheds

The two watersheds selected, both of which are used for public water supply, are located in the municipalities of Santa Cruz das Palmeiras and Piedade, respectively, in the state of São Paulo (Figure 1). In the Ribeirão da Prata River watershed (RPRWS), in the municipality of Santa Cruz das Palmeiras, sugarcane monoculture predominates. In the Pirapora River watershed (PRWS), in the municipality of Piedade, there are a variety of fruit and vegetable crops on small- and medium-sized properties. Those watersheds were chosen as study areas for the continuation of a research project funded by the São Paulo Research Foundation and the Brazilian Unified Health Care System Research Program,¹ in which pesticides in the water supplies of several municipalities in the state of São Paulo were monitored during 2014. The results showed elevated levels of pesticide residues in the catchment water sources within the RPRWS and PRWS.

Santa Cruz das Palmeiras has a population of 29,932 inhabitants, is within Water Resources Management Zone 9 (WRMZ - Mogi-Guaçú), and presents a landscape of flat hills with elevations of 20-50 m, red Oxisol being the predominant soil type. According to the Köppen climate classification system, the climate of the region is type Aw (tropical savanna), with dry winters and an average annual rainfall of 1500 mm. The main economic activity in Santa Cruz das Palmeiras is the production of sugarcane. Piedade has a population of 52,123 inhabitants, is mostly within Water Resources Management Zone 10 (WRMZ - Sorocaba/Middle Tiete), and presents a type of landscape known in Brazil as *mares de morros* ("seas of hills") with elevations between 80 m and 200 m, red-yellow Ultisol being the predominant soil type. According to the Köppen climate classification system, the climate of the region is type Cwa (humid subtropical), with dry winters and an average annual rainfall of 1300 mm. The main economic driver in Piedade is the service industry, followed by agriculture (production of vegetables and legumes).

¹*Fundação de Amparo à Pesquisa do Estado de São Paulo/Programa de Pesquisa para o Sistema Único de Saúde* (FAPESP/PPSUS, São Paulo Research Foundation/Brazilian Unified Health Care System Research Program; Grant no. 2014/50016-3; project title: Evaluation of pesticide residues and pathogenic protozoa in the public water supply in the state of São Paulo).





Figure 1. Location of the studied municipalities and the Water Resources Management Zones (WRMZs) within the state of São Paulo.

SIRGAS, Sistema de Referência Geocêntrico para as Américas (Geocentric Reference System for the Americas); IBGE, Instituto Brasileiro de Geografia e Estatística (Brazilian Institute of Geography and Statistics); CVS, Centro de Vigilância Sanitária (Center for Health Surveillance); NARA, Núcleo de Pesquisas em Avaliação de Riscos Ambientais (Center for Research in the Evaluation of Environmental Risk).

For the delimitation of the drainage area of the water catchment area of the municipalities, the hydrographic network was extracted from the Hydrology tool of the ArcGIS software, Version 10.1. Digital Elevation Models (DEMs) were obtained from the TOPODATA project of the Instituto Nacional de Pesquisas Espaciais (INPE, Brazilian National Institute for Space Research), which were derived from Shuttle Radar Topography Mission data (SRTM) provided by the United States Geological Service, with a resolution of 30 m and 16 bits. We thus generated the files for flow direction, a process that defines the flow of the watercourse, pixel by pixel, in eight directions, sending each flow in one of those directions. The algorithm for calculating the discrete aspect (flow direction) was derived by Jenson et al. (1988), the flow direction being made in a 3×3 moving window that traverses the DEM and assigns to each cell the direction of one of its eight neighbors. The attribution is made by determining the direction with the steepest slope: the slope is calculated as dZ/dS, where dZ is the difference between the elevations in the cell of the considered direction and the central cell, and dS has a value of 1 in the perpendicular directions and a root of 2 in the diagonal directions (Mendes and Cirilo, 2001). The pixels are given values from 1 to 255, and the values from each direction to the center respect the following distribution:

The next step was the identification of flow accumulation, the pixels with accumulated flow represent areas with greater flow concentration; from those data, together with the previous file, the drainage network was extracted and later ordered according to the Strahler method (Christofoletti, 1980). The area of water contribution to the catchment area for the public water supply was then calculated for both municipalities with the ArcGIS Watershed tool, which uses data related to flow direction, drainage networks, and points of interest. That delimitation corresponds to the basin of water contribution of the catchment area, which was considered in the following stages of this study.



2.2. Classification of land use

For the classification of land use/land cover, RapidEye satellite images, dated October 2014 and made available by the Brazilian Ministry of the Environment, were submitted to the Supervised Maximum Likelihood Classification method. The RapidEye is a system composed of five identical remote sensing satellites in the same sun-synchronous orbit, at an altitude of 630 km. The image collection path is 77 km wide and 1500 km long. The satellite image is composed of five spectral bands (blue, green, red, red edge, and near-infrared), with a 5-m resolution in the Horizontal Datum WGS84 (Antunes *et al.*, 2014).

We classified the images with ArcGIS software, Version 10.1, using the maximum likelihood method, because it presents better accuracy and global accuracy values than do other classification methods (Cattani *et al.*, 2013). The method involves pixel-by-pixel multispectral analysis, considers the weighting of the distances between means of the gray levels of the classes, and uses the training samples to calculate the probability of a pixel belonging to a certain class (IBGE, 2001). Google Earth Pro images were used in order to facilitate the visual interpretation process, and field work was used in order to quantify agricultural land use within the catchment area.

2.3. Water balance analysis

To analyze the impact of land use on the hydrological cycle of the areas, the SWAT model was developed to predict the long-term effects of water management and agricultural practices on the hydrological cycle of watersheds (Arnold *et al.*, 1998). The SWAT employs the modified universal soil loss equation, which uses the amount of runoff to simulate erosion and sediment production (Arnold *et al.*, 2012). The model performs the simulation after dividing the area into subwatersheds, grouping them by the characteristics they have in common, their specificities, and their contributions to the hydrological cycle. The subwatersheds are further divided into hydrological response units (HRUs), which correspond to smaller divisions within the subwatersheds, with unique land use, soil, and management features (Neitsch *et al.*, 2011).

The process of water balance analysis discriminates surface runoff, infiltration, evapotranspiration, lateral flow, drainage, tributary channels, and water redistribution, according to the soil profile. The SWAT simulates the soil hydrological cycle based on the following Equation 1 (Neitsch *et al.*, 2011):

$$SW_1 = SW_0 + \sum^t (R_{day} - Q_{surf} - E_a - W_{seep} - Q_{gw})$$
(1)

Where SW_1 is the final amount of water in the soil (mmH₂O), SW_0 is the initial soil moisture (in mmH₂O) on day *i*, *t* is the time in days, R_{day} is the amount of precipitation (in mmH₂O) on day *i*, Q_{surf} is the surface runoff (in mmH₂O) on day *i*, E_a is the evapotranspiration (in mmH₂O) on day *i*, W_{seep} is the amount of water (in mmH₂O) entering the aeration zone of the soil profile on day *i*, and Q_{gw} is the amount of flow return (in mmH₂O) on day *i*.

This water balance analysis considers the characteristics of the soil, land use/land cover, slope, and climate (Arnold *et al.*, 2012). The daily data for precipitation, temperature, relative humidity, solar radiation, and wind speed in the 2008-2015 period were obtained from the Brazilian National Meteorological Institute for the stations closest to the study areas (INMET, 2016). The monthly precipitation data for the Piedade and Santa Cruz das Palmeiras were obtained from the Center for the Promotion of Agriculture of the São Paulo State University at Campinas (CEPAGRI, 2016). As previously mentioned, the DEMs with a resolution of 30 m and 16 bits were obtained from the INPE. Soil data, at a scale of 1:500,000, were obtained from the Brazilian Agency for Agricultural Research (EMBRAPA, 2006).



3. RESULTS AND DISCUSSION

For the RPRWS, the area of water contribution, calculated from the catchment area, was 11.6 km² divided into 23 subwatersheds or HRUs, with slopes of 3-8% and for PRWS the area of contribution of the catchment area was 93.59 km² divided the PRWS into 25 subwatersheds or HRUs, with slopes of 20-45%. The results of primary simulation show that surface runoff and flow have behaviors that are similar and are directly related to the pattern of precipitation distribution (Figure 2). The period of high surface runoff corresponded to the rainy months (October through March), for these months the SWAT simulation produced the greater differences between observed values; similar results were obtained by Sousa *et al.* (2018) even when the authors compared two methods of rainfall simulation.



Figure 2. Mean values for observed precipitation, simulated precipitation, surface runoff, and flow, in Santa Cruz das Palmeiras (A) and Piedade (B). 2008-2015.

The hydrological results tend to be better when there is more than one rainfall station in the basin, and the results also depend on the size of the drainage area. Even in simulations calibrated using Nash-Sutcliffe efficiency (NSE), the model tends to underestimate periods of higher rainfall as demonstrated by Pereira *et al.* (2016). Despite the limitations of the data, this simulation was satisfactory, especially when analyzing other hydrological parameters (Table 1).



For the RPRWS, the observed evapotranspiration was estimated at 60% of the evapotranspiration potential and 51% of the total precipitation. Soil percolation and surface runoff corresponded to the greatest amount of water in the terrestrial process, being 47% of the volume precipitated. That can be associated with the permeability of Oxisol (the predominant soil type in the area), as well as with the type of vegetation cover. The curve number was 77.9, a value considered high and that can describe a situation of reduced vegetation cover or intensive agriculture (Tucci, 1993).

Parameter	RPRWS	PRWS
Precipitation (mm)	1424.5	1261.9
Potential evapotranspiration (mm)	1217.2	1253.3
Observed evapotranspiration (mm)	734.0	621.3
Surface runoff (mm)	353.9	113.4
Subsurface flow (mm)	21.5	469.93
Percolation (mm)	313.9	52.5
Return flow (mm)	272.9	32.3
Other* (mm)	40.04	27.7
Curve number	77.9	64.4

Table 1. Water balance estimated with the SWAT model.

RPRWS, Ribeirão da Prata River watershed (in the town of Santa Cruz das Palmeiras); PRWS, Pirapora River watershed (in the town of Piedade).

*Recharge of the deep aquifer and return of the shallow aquifer.

For the PRWS, the simulation estimated the observed evapotranspiration at 49.7% of the evapotranspiration potential and 49.2% of the total precipitation, and the subsurface (lateral) flow accounted for 37.2% of the precipitation, those being the main destinations of the water entering the system. Percolation and surface runoff were considered low and collectively corresponded to only 13% of the total rainfall. The estimated curve number was significantly lower for the PRWS than for the RPRWS, reflecting greater preservation in the former, and consequently the surface runoff, since they are directly related processes.

The results of the hydrological simulation were considered satisfactory, because there is coherence between the values of precipitation, surface runoff, number curve, soil type and LULC. The curve number is related to the LULC and soil type is considered one of the most sensitive parameters in hydrological modeling (Ficklin *et al.*, 2013), as demonstrated by Fukunaga *et al.* (2015), the result of the SWAT simulation in a Brazilian Southeastern basin presented values of simulation higher than those observed for precipitation and surface runoff, which increased the value of the Curve Number. Nevertheless, in the calibration process the authors concluded that this difference is within the expected range, and in accordance with other simulations in tropical watersheds.

According to Wallace *et al.* (2018), the curve number is often used because it is simple, stable and does not require a long historical series of data. The authors evaluated the influence of basin size on the variation of several parameters in the SWAT hydrologic simulation process. The authors concluded that although there was a difference between the observed and simulated values, the modeling was satisfactory and indicated as a watershed planning and management tool.

The classification of LULC (Figure 3) indicated that the conditions of water source preservation differed between the two watersheds. In the RPRWS, more than 80% of the area was occupied by agricultural activities, whereas forest occupied only 6.28%, well below the 20% established by legislation (Brasil, 2006). In contrast, the PRWS presented 53.29% forest

and 35.82% agricultural areas. The proportion of land used for agricultural purposes within the two watersheds corresponded to that observed for the respective municipalities.

The poor preservation in the RPRWS was attributable to the agricultural production method adopted by the municipality of Santa Cruz das Palmeiras, which is dependent on sugarcane monoculture, as well as coffee and oranges, which are grown as permanent crops (IBGE, 2015). Likewise, the degree of preservation in the PRWS reflects the allocation of land in the municipality of Piedade, where there are small plots and variety of crops, including maize, onions, sweet potatoes, and beans, persimmons, avocados, and grapes being grown as permanent crops (IBGE, 2015) (Table 2).



Figure 3. Classification of land use/occupation and simulation of surface runoff in the watersheds.

RPRWS: (A) Classification of land use/occupation; and B) estimated annual surface runoff (mm), by subwatershed. PRWS: (C) Classification of land use/occupation; and (D) estimated annual surface runoff (mm), by subwatershed.



RPRWS		PRWS	
Land use	(%)	Land use	(%)
Sugarcane	57.42	Agricultural	32.65
Coffee	4.63	Pasture	8.26
Forest	6.28	Forest	53.29
Water	0.23	Water	0.41
Urban area	6.66	Urban area	2.22
Bare soil	24.78	Bare soil	3.17

 Table 2. Classification of land use/occupation in the two study areas.

RPRWS, Ribeirão da Prata River watershed (in the town of Santa Cruz das Palmeiras); PRWS, Pirapora River watershed (in the town of Piedade).

Applying the Supervised Maximum Likelihood Classification method to the RapidEye satellite images allowed us to observe stretches, throughout the catchment areas, where there was no riparian forest and there was exposure to agricultural activities, aspects that potentiate the transport of sediment and pesticides. Similar results were obtained by Twesigye *et al.* (2011), based on the supervised classification of a historical series of Landsat 5 images of Lake Victoria, in Africa. The authors correlated the reduction in natural vegetation with the expansion of agriculture and the presence of pesticides in the watershed.

For the RPRWS, the surface runoff was highest in the subwatersheds with a preponderance of exposed soil, followed by those with a preponderance of sugarcane (Figure 3, A and B). We also observed a scarcity of natural vegetation, especially in the Permanent Preservation Areas, which correspond to the preservation of the riparian forests. Within the PRWS, the surface runoff values were highest in the subwatersheds with a predominance of agriculture (Figure 3, C and D) and lowest in those with the most well preserved vegetation cover.

The results of our water balance evaluation were satisfactory for analysis of the behavior of the main variables of the hydrological cycle and the relationship with LULC. The rates of percolation and surface runoff were significantly higher in the RPRWS than in the PRWS, correlating with soil permeability, as well as with the degree and type of vegetation cover. Oxisol, the predominant soil type in the RPRWS, is a soil that is deep, well drained, and permeable. The absence of vegetation cover and the cultivation of sugarcane, which has short roots, tend to contribute to the increase of surface runoff (Armas *et al.*, 2007).

The PRWS presented results consistent with greater preservation of natural vegetation and therefore greater water storage capacity of the soil. Although Ultisol, a shallow soil type, predominates in the PRWS, the preserved vegetation cover favors the greater subsurface flow. Because the PRWS is in a region with a "sea of hills" landscape, the loss of natural vegetation in the area would increase the risk of soil instability and silting of the water sources. In both areas, the surface runoff rates were higher in the subwatersheds in which there was a predominance of exposed soil and agricultural activity. A similar result was obtained by Oliveira *et al.* (2018a) which identified that deforestation and agricultural use increase peak flows at the same time as percolation decreases; these alterations can result in degradation of source water quality.

Armas *et al.* (2007) found that the presence of pesticides in surface waters in the Piracicaba River watershed was related to aspects of land use, mainly to the predominance of sugarcane cultivation. In the Corumbataí River and its tributaries, the authors found high levels of atrazine, ametryn and glyphosate. In addition to contaminant loading, different land uses can also influence the amount of soil lost and the water balance within the watershed, as demonstrated by Silva *et al.* (2011). Evaluating the degree of contamination of water sources in the Jacaré

River watershed, within Water Resources Management Zone 13, Souza *et al.* (2013) concluded that the level of ammonia was high in the subwatersheds that did not contain Permanent Preservation Areas or that presented only grass cover. The authors found that preservation of riparian forests along the river also reduced the levels of dissolved oxygen, nitrates, and fine sediment in the water sources.

A similar result was reported by Mello *et al.* (2017), who used the SWAT to analyze the influence of land use on water quality in the Sarapuí River, near the city of Sorocaba, also in the state of São Paulo. The authors concluded that there were high levels of sediment, decreasing water quality, in the subwatershed areas in which there was agricultural activity. In addition to the spatial variation, those authors identified a temporal variation in the concentrations of sediments and substances, which were found to be higher during the rainy months.

The use of SWAT to predict impacts on the water management has been recommended as decision support in different countries, including studies on climate and land-use change, crossboundary water transfers, nitrogen loads and others (Abbaspour *et al.*, 2015). In addition, it is possible to prioritize areas of the basin to monitor and control pollutants, and thus to prevent or improve water quality (Conolly *et al.*, 2015). The lack of continuous monitoring data on flow and sediment in watersheds has been a limiting factor for the validation of the results obtained and for their use in the formal processes of water resource management in the watersheds. Nevertheless, the SWAT has been considered an important tool for the prediction of maximum annual concentrations of pollutants even in unmonitored basins and without modeling calibration (Winchell *et al.*, 2018).

At the beginning of the GIS application, the mapping LULC contributed to differentiate and quantify the main activities in a watershed, in the last few years this analysis has become more sophisticated, it is possible to relate the LULC with the hydrological dynamics, emission of pollutants, to identify patterns of alteration in the spatial ordering. From this information, it is also possible to predict costs to the management of natural resources, using it as a decision-support system (Shao *et al.*, 2017).

It is understood that integrated management of watersheds should consider, in an interconnected way, the physical processes of water and the hydrological cycle, as well as their relationships with other natural strata, such as soil, relief, flora, and fauna, together with the interests of the multiple uses of water sources, and participatory management relationships at different administrative levels (Machado, 2003). However, more than 20 years after the introduction of the National Water Resources Policy and the passage of São Paulo State Water Protection Law No. 9866/97, the use of water for economic pursuits continues to be prioritized, resulting in the degradation of various water sources, especially by agro-industrial sector. The state of São Paulo has several water sources that are at high risk, requiring conservation and restoration measures (IDS and LABGEO, 2017; Oliveira *et al.*, 2018b) to ensure the supply and quality of water for human consumption.

The determination of areas with greater surface runoff can support the actions to prevent contamination of water in the basin. Increased surface runoff caused by agricultural occupation of the watershed may lead to water contamination, requiring additional and costly treatment to ensure safe water. With integrated management, managers can prioritize these areas for control and reduction of the use of pesticides, collection and treatment of domestic effluents, incentives for the preservation of forested areas on agricultural property, among others. The knowledge of hydrology may be used to improve environmental studies and the management of natural resources.

This work corroborates the importance of applying geotechnologies as decision support for water-resource management, not only for analyses of water availability, but mainly to emphasize the relevance of its application to the management of water quality and the risks to which the source of supply is submitted.



4. CONCLUSION

The present study identified alterations in the hydrological cycle according to land use/land cover. We also showed that agricultural activities and a lack of natural vegetation increase surface runoff, which is a concern for water quality. The remote-sensing tools employed in our study represent an efficient, fast and low-cost means of classifying land use/occupation in watersheds. Using those tools in combination with ecosystem modeling tools, such as the SWAT, allow land use patterns to be correlated with the quality of the water supply and areas of greater concern in terms of the impact of water sources to be identified. This favors the collection of information and the development of plans to facilitate the integrated management of watersheds by the different actors involved, the ultimate goal being, above all, to maintain water quality, to protect the sources of the public water supply.

5. REFERENCES

- ABBASPOUR, K. C.; ROUHOLAHNEJAD, E.; VAGHEFI, S.; SRINIVASAN, R.; YANG, H.; KLØVE, B. A continental-scale hydrology and water quality model for Europe: Calibration and uncertainty of a high-resolution large-scale SWAT model. Journal of Hydrology, v. 524, p. 733-752, 2015. https://doi.org/10.1016/j.jhydrol.2015.03.027
- ANTUNES, M. A. H.; DEBIASI, P.; SIQUEIRA, J. C. S. Avaliação espectral e geométrica das imagens Repideye e seu potencial para o mapeamento e monitoramento agrícola e ambiental. **Revista Brasileira de Cartografia**, v. 66, n. 1, p. 105-113, 2014.
- ARMAS, E. D.; MONTEIRO, R. T. R.; ANTUNES, P. M.; SANTOS, M. A. P. G.; CAMARGO, P. B. Diagnóstico Espaço-Temporal da ocorrência de Herbicidas nas águas superficiais e sedimentos do Rio Corumbataí e principais afluentes. Química Nova, v. 30, n. 5, p. 1119-1127, 2007.
- ARNOLD, J.; SRINIVASAN, R.; MUTTIAH, R. S.; WILLIAMS, J. R. Large area hydrologic modeling and assessment part I: Model development. Journal of the American Water Resources Association, v. 34, p. 73-89, 1998. https://doi.org/10.1111/j.1752-1688.1998.tb05961.x
- ARNOLD, J.; MORIASI, D. N.; GASSMAN, P. W.; ABBASPOUR, K. C.; WHITE, M. J.;
 SRINIVASAN, R.; SANTHI, C.; HARMEL, R. D.; GRIENSVEN, Van; VANLIEW, M. W.; KANNAN, N.; JHA, M. K. SWAT: Model Use, Calibration, and Validation.
 ASABE, American Society of Agricultural and Biological Engineers, v. 55, n. 4, p. 1491-1508, 2012.
- BRESSIANI, D. A.; GASSMAN, P. W.; FERNANDES, J. G.; GARBOSSA, L. H. P.; SRINIVASAN, R.; BONUMÁ, N. B.; MENDIONDO, M. E. Review of Soil and Water Assessment Tool (SWAT) applications in Brazil: Challenges and prospects. International Journal of Agricultural and Biological Engineering, v. 8, n. 3, p. 9-35, 2015.
- BRASIL. Presidência da República. Lei n. 11.428, de 22 de dezembro de 2006. Dispõe sobre a utilização e proteção da vegetação nativa do Bioma Mata Atlântica, e dá outras providências. Diário Oficial [da] União: seção 1, Brasília, DF, p. 1, 26 dez. 2006.
- CATTANI, E. V.; MERCANTE, E.; DOUZA, C. H. W.; WRUBLACK, S. C. Desempenho de algoritmos de classificação supervisionada para imagens do satélite RapidEye. *IN:* SIMPÓSIO BRASILEIRO DE SENSORIAMENTO REMOTO, 16., 13 a 18 abr. 2013, Foz do Iguaçú. Anais... São José dos Campos: INPE, 2013. p. 8005-8010.

- CEPAGRI. Clima dos Municípios Paulistas. Available at: http://www.cepagri.unicamp.br/outras-informacoes/clima-dos-municipiospaulistas.html Access: Jan. 2016.
- CETESB. Qualidade das águas interiores no estado de São Paulo 2016. São Paulo: CETESB, 2017. Available at: http://aguasinteriores.cetesb.sp.gov.br/publicacoes-e-relatorios Access: Sep., 2017.
- CHISTOFOLETTI, A. **Geomorfologia**: a análise de bacias hidrográficas. 2. ed. São Paulo: Edgard Blucher, 1980.
- CONNOLLY, N. M.; PEARSON, R. G.; LOONG, D.; MAUGHAN, M. Water quality variation along streams with similar agricultural development but contrasting riparian vegetation. Agriculture, Ecosystems and Environment, v. 213, p. 11-20, 2015. https://doi.org/10.1016/j.agee.2015.07.007
- EÇA, R. F.; FRACALANZA, A. P.; JACOBI, P. R. A problemática da água na agenda governamental do estado de São Paulo (1920-1991). **Revista Política Pública**, v. 17, n.1, p. 49-58, 2013. http://dx.doi.org/10.18764/2178-2865.v17n1p49-58
- EMBRAPA. Sistema Brasileiro de Classificação de Solos. 2. ed. Rio de Janeiro, 2006.
- FICKLIN, D. L.; LUO, Y.; ZHANG, M. Watershed modeling of hydrology and water quality in the Sacramento River watershed, California. Hydrological Processes, v. 27, p. 236-250, 2013. https://doi.org/10.1002/hyp.9222
- FUKUNAGA, D. C.; CECILIO, R. A.; ZANETTI, S. S.; OLIVEIRA, L. T.; CAIADO, M. A. C. Application of SWAT hydrologic model to a tropical watershed in Brazil. Catena, v. 125, p. 206-213, 2015. https://doi.org/10.1016/j.catena.2014.10.032
- IBGE. Introdução ao Processamento Digital de Imagens. Rio de Janeiro, 2001. 94p.
- IBGE. Produção Agrícola Municipal: 2014. Rio de Janeiro, 2015.
- IDS; LABGEO POLI USP. Mananciais paulistas como prioridade da agenda pública: identificação de áreas críticas e proposta de zoneamento. São Paulo, 2017. 33 p. Available at: https://www.aliancapelaagua.com.br/wp-content/uploads/2017/04/Mananciaispaulistas-Suma%CC%81rio-Executivo-2017.pdf Access: Sep. 2017.
- INMET. **Dados Históricos**. Available: http://www.inmet.gov.br/portal/index.php?r=bdmep/bdmep Access: Jan. 2016.
- JACOBI, P. R.; FRACALANZA, A. P.; SILVA-SÁNCHEZ, S. Governança da água e inovação na política de recuperação de recursos hídricos na cidade de São Paulo. **Cadernos Metrópole**, v. 17, n. 33, p. 61-81, 2015. http://dx.doi.org/10.1590/2236-9996.2015-3303
- JENSON, S. K.; DOMINGUE, J. O. Extracting Topographic Structure from Digital Elevation Data for Geographic Information System Analysis. Photogrammetric Engineering and Remote Sensing, v. 54, n. 11, p. 1593-1600, 1988.
- LALANCETTE, C.; PAPINEAU, I.; PAYMENT, P.; DORNER, S.; SERVAIS, P.; BARBEAU, B.; GIOVANNI, G. D.; PRÉVOST, M. Changes in Escherichia coli to Cryptosporidium ratios for various fecal pollution sources and drinking water intakes. Water Research, v. 55, p. 150-161, 2014.



- LARI, S. Z.; KHAN, N. A.; GANDHI, K. N.; MESHRAM, T. S.; THACKER, N. P. Comparison of pesticide residues in surface water and ground water of agriculture intensive areas. Journal of Environmental Health Science & Engineering, v. 12, n. 1, 2014. http://dx.doi.org/10.1186/2052-336X-12-11
- MACHADO, C. J. S. Recursos hídricos e cidadania no brasil: limites, alternativas e desafios. **Revista Ambiente & Sociedade**, v. 6, n. 2, p. 121-136, 2003. http://dx.doi.org/10.1590/S1414-753X2003000300008
- MARENGO, J. A.; NOBRE, C. A.; SELUCHI, M. E.; CUARTAS, A.; ALVES, L. M.; MENDIONDO, E. M.; OBREGÓN, G.; SAMPAIO, G. A seca e a crise hídrica de 2014-2015 em São Paulo. **Revista USP**, n. 106, p. 31-44, 2015. https://doi.org/10.11606/issn.2316-9036.v0i106p31-44
- MELLO, K.; RANDHIR, T. O.; VALENTE, R. A.; VETTORAZZI, C. A. Riparian restoration for protecting water quality in tropical agricultural watersheds. **Ecological Engineering**, v. 108, p. 514-524, 2017. https://doi.org/10.1016/j.ecoleng.2017.06.049
- MENDES, C. A. B.; CIRILO, J. A. Geoprocessamento em recursos hídricos: Princípios, Integração e Aplicação. Porto Alegre: ABRH, 2001.
- NEITSCH, S. L.; ARNOLD, J. G.; KINIRY, J. R.; WILLIAMS, J. R. Soil & Water Assessment Tool (SWAT). Texas: Texas A&M University System College Station, 2011. (Relatório técnico, n. 406).
- OLIVEIRA, D. G.; VARGAS, R. R.; SAAD, A. R.; ARRUDA, R. O. M.; DALMAS, F. B.; AZEVEDO, F. D. Land use and its impacts on the water quality of the Cachoeirinha Invernada Watershed, Guarulhos (SP). **Revista Ambiente & Água**, v. 13, n. 1, p. 1-17, 2018a. http://dx.doi.org/10.4136/ambi-agua.2131
- OLIVEIRA, V. A.; MELLO, C. R.; VIOLA, M. R.; SRINIVASAN, R. S. Land-use change impacts on the hydrology of the upper Grande River basin, Brazil. **CERNE**, v. 24, n. 4, p. 334-343, 2018b. http://dx.doi.org/10.1590/01047760201824042573
- PEREIRA, D. R; MARTINEZ, M. A; PRUSKI, F. F; SILVA, D. D. Hydrological simulation in a basin of typical tropical climate and soil using the SWAT model part I: Calibration and validation tests. Journal of Hydrology: Regional Studies, v. 7, p. 14-37, 2016. https://doi.org/10.1016/j.ejrh.2016.05.002
- PORTO, M. F. A.; KELMAN, J. Water Resources Policy in Brazil. **Rivers**, v. 7, n. 3, p. 250-257, 2000.
- SALMORAL, G.; WILLAARTS, B. A.; GARRIDO, A.; GUSE, B. Fostering integrated land and water management approaches: Evaluating the water footprint of a Mediterranean basin under different agricultural land use scenarios. Land Use Policy, v. 61, p. 24-39, 2017. https://doi.org/10.1016/j.landusepol.2016.09.027
- SEADE. **Sistema SEADE de Projeções Populacionais**. Available at: http://produtos.seade.gov.br/produtos/projpop/ Access: Sep. 2017.
- SHAO, H.; YANG, W.; LINDSAY, J.; LIU, Y.; YU, Z.; OGINSKYY, A. An open source gisbased Decision Support System for watershed evaluation of best management practice. Journal of the American Water Resources Association, v. 53, n. 3, p. 521- 531, 2017. https://doi.org/10.1111/1752-1688.12521



- SILVA, V. A.; MOREAU, M. S.; MOREAU, A. M. S.; REGO, N. A. Uso da terra e perda de solo na Bacia Hidrográfica do Rio Colônia, Bahia. Revista Brasileira de Engenharia Agrícola e Ambiental v. 15, n. 3, p. 310-315, 2011. http://dx.doi.org/10.1590/S1415-43662011000300013
- SMITH, P.; HOUSE, J. I.; BUSTAMANTE, M.; SOBOCKA, J.; HARPER, R.; PAN, G.; WEST, P. C.; CLARK, J. M.; DHYA, T.; RUMPEL, C.; PAUSTIAN, K.; KUIKMAN, P.; COTRUFO, M. F.; ELLIOTT, J. A.; MCDOWELL, R.; GRIFFITHS, R. I.; ASAKAWA, S.; BONDEAU, A.; JAIN, A. K.; MEERSMANS, J.; PUGH, T. A. M. Global change pressures on soils from land use and management. Global Change Biology, v. 22, p.1008–1028, 2016. https://doi.org/10.1111/gcb.13068
- SOUSA, W. S.; VIANA, J. F. S.; SILVA, R. R.; IRMÃO, R. A. Estimativa do balanço hídrico de uma sub-bacia da Bacia Hidrográfica do Rio Ipanema com o Modelo SWAT. Journal of Environmental Analysis and Progress, v. 03, n. 01, p. 146-154, 2018. https://doi.org/10.24221/jeap.3.1.2018.1708.146-154
- SOUZA, A. L. T.; FONSECA, D. G.; LIBÓRIO, R. A.; TANAKA, M. O. Influence of riparian vegetation and forest structure on the water quality of rural low-order streams in SE Brazil. Forest Ecology and Management, v. 298, p. 12-18, 2013. https://doi.org/10.1016/j.foreco.2013.02.022
- TAYLOR, S. D.; HE, Y.; HISCOCK, K. M. Modelling the impacts of agricultural management practices on river water quality in Eastern England. Journal of Environmental Management, v. 180, p. 147-163, 2016. https://doi.org/10.1016/j.jenvman.2016.05.002
- TWESIGYE, C. K.; ONYWERE, S. M.; GATENGA, Z. M.; MWAKALILA, S. S.; NAKIRANDA, J. K. The impact of land use activities on vegetation cover and water quality in the Lake Victoria watershed. The Open Environmental Engineering Journal, v. 4, p. 66-77, 2011. http://ir.mksu.ac.ke/handle/123456780/4173
- TUCCI, C. E. M. Hidrologia: ciência e aplicação. São Paulo: ABRH; EDUSP, 1993.
- WALLACE, C. M.; FLANAGAN, D. C.; ENGEL, B. A. Evaluating the Effects of Watershed Size on SWAT Calibration. Water, v. 10, n. 898, p. 2-27, 2018. https://doi.org/10.3390/w10070898
- WARD, M. H.; NUCKOLS, J. R.; WEIGEL, S. J.; MAXWELL, S. K.; CANTOR, K. P.; MILLER, R. S. Identifying populations potentially exposed to agricultural pesticides using remote sensing and a geographic information system. Environmental Health Perspectives, v. 108, n. 1, p. 5-12, 2000. https://doi.org/10.1289/ehp.001085
- WINCHELL, M. F.; PERANGINANGIN, N.; SRINIVASAN, R.; CHEN, W. Soil and Water Assessment Tool Model Predictions of Annual Maximum Pesticide Concentrations in High Vulnerability Watersheds. Integrated Environmental Assessment and Management, v. 14, n. 3, p. 358–368, 2018. https://doi.org/10.1002/ieam.2014
- ZHOU, P.; HUANG, J.; PONTIUS JR., R. G.; HONG, H. New insight into the correlations between land use and water quality in a coastal watershed of China: Does point source pollution weaken it? Science of the Total Environment, v. 543, p. 591-600, 2016. https://doi.org/10.1016/j.scitotenv.2015.11.063

