

1 Article

2 A regional sensitivity analysis of a multi-variable 3 hydrological model: A case study of a Greek 4 catchment

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13 **Abstract:** The importance of climate data in hydrological process simulation is widely recognized.
14 The evaluation of the hydrological budget response to climate variability is required especially in
15 water resource management. The present paper illustrates a case study of sensitivity analysis for
16 the hydrological model SWAT (Soil and Water Assessment Tool) using climate data from the
17 Havrias river basin in north Greece. The ERA-Interim reanalysis daily climate data, were used as
18 input data to drive the SWAT model. The SWAT model was calibrated for the period from 1981 to
19 2000. The sensitivity of the hydrological parameters to the alteration of the climate data was
20 analyzed by using eleven hypothetical scenarios. These scenarios regard different combinations of
21 temperature, wind speed, precipitation and relative humidity. The results show that the changes of
22 precipitation temperature and relative humidity have significant influence in evapotranspiration
23 and percolation (and consequently recharge) in the study region. On the contrary, the wind speed
24 negligibly affects on the hydrological components. Overall, the Havrias river basin hydrological
25 budget is sensitive to shifts in climate data and the utilization of reliable and accurate climate models
26 outputs is necessary in order water managers to be able to build scenarios providing sustainability
27 against the potential future climate change impacts.

28 **Keywords:** SWAT software; Havrias River Basin; climate variability, water budget components

29 **PACS:** J0101

30 1. Introduction

31 Numerous multi-variable hydrological models have been widely implemented to comprehend
32 the hydrological processes and establish the water balance. The credibility and the effectiveness of
33 these models are mostly dependent by their inputs, especially the climate data. The comprehension
34 of the hydrological budget components response to the climate variability has become more and more
35 fundamental. Based on the Intergovernmental Panel on Climate Change [1], the climate change
36 effects on water resources are unambiguously. In several scientific studies were used hydrological
37 models in order to assess the hydrological cycle response under different climate scenarios [2-4]. Song
38 et al. 2015 [5] presented a review of the sensitivity analysis in hydrological simulation underlining its
39 importance and appropriate role.

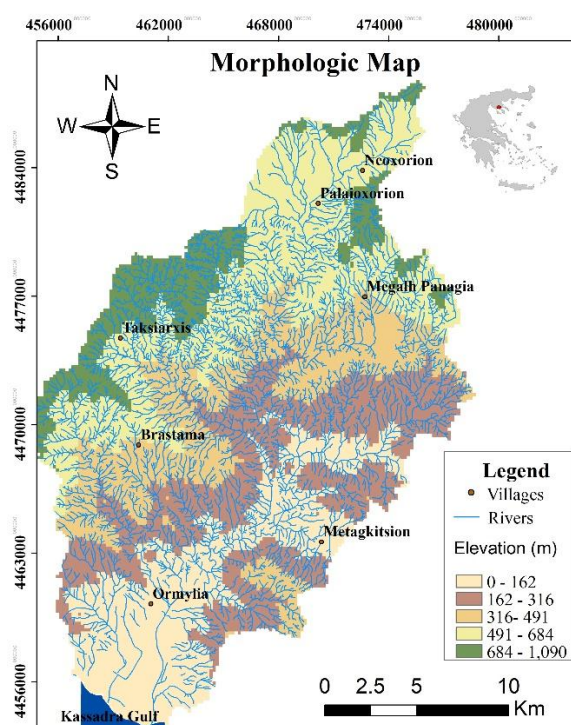
40 The objective of this paper is the sensitivity analysis of the hydrological budget components of
41 a watershed to variations in climate parameters. The Soil and Assessment Water Tool (SWAT) was
42 used for the modelling of the watershed. The SWAT hydrological model is an suitable and useful tool
43 for the watershed process simulation such as the water balance and quality, the crop growth, the
44 climate change and the land management practices. The SWAT application was conducted in the

45 Havrias river basin which is situated in north Greece. The Havrias river basin was selected as the case
 46 study, because it is an agricultural and ungaged watershed and it can be considered as a
 47 representantive watershed of the Greek region. The ultimate scope of this paper is to comprehend
 48 which of the climate parameters mostly influence on model's performance.
 49

50 2. Materials and Methods

51 2.1. Study Area

52 The Havrias river basin is one of the most significant watershed of Halkidiki in north Greece.
 53 The basin drains into the Kassandra Gulf. Its elevation varies between 0 m and 1090 m, covering an
 54 extent of 472 km², based on the GIS Analysis. The mean slope of the watershed is about 22%. The
 55 Mediterranean climate Csa, according to Köppen classification [6] is identified in the research area.
 56 The agricultural land represents approximately 33% of the total area. The major crops are the olive
 57 groves. Broad-leaved, coniferous and mixed forests occupy the northern part of the watershed.
 58 Geologically, the coastal part is consisted of alluvial deposits, lacustrine and lagoon sediments, red
 59 clay and basic conglomerates series. Metasedimentary rocks, gneiss, phyllite, recrystallized
 60 limestone, gabbro, pyroxenites and dounites are encountered in the rest of the basin. The main aquifer
 61 systems are developed within alluvial deposits (porous aquifer) and limestones (karstic aquifer).
 62 Water needs for domestic and irrigation use are mainly covered by the exploitation of the
 63 aforementioned aquifers through numerous boreholes and wells.
 64



65
 66 **Figure 1.** The morphological map of the Havrias river Basin.

67 2.2. SWAT Model

68 2.2.1 Description of SWAT Model

69 The Soil and Water Assessment Tool (SWAT) is a watershed scale hydrological model [7-8]
 70 which is developed by the United States Department of Agriculture-Agricultural Research Service
 71 (USDA-ARS) (Arnold et al., 1998). It is a semi-distributed and physically based model, running on a
 72 daily time step. Its task is to assess the impact of the land and agricultural management practices on

73 water, sediment and agricultural chemical yields. In SWAT, any watershed is separated into sub-
 74 watersheds based on the topography and the drainage network. Then, each sub-watershed is further
 75 divided into smaller units which are called hydrologic response units (HRUs). The HRU can be
 76 determined as an area within a sub-watershed with the same land use classification, soil properties,
 77 slope characteristics and management combinations. The hydrological process is described by the
 78 water balance equation:

$$SW_t = SW_o + \sum_{i=1}^t (R - Q_{surf} - ET - P - QR) \quad (1)$$

79 where

80 SW_t = the final soil water content (mm), SW_o = the initial soil soil water content (mm), R = the daily
 81 precipitation (mm), Q_{surf} = the daily runoff (mm), ET = the daily evapotranspiration (mm), P = the daily
 82 percolation (mm), QR = the groundwater flow per day

83 A detail description of the SWAT model is demonstrated by Arnold et al. (2012) [9].

84 2.2.2 Data

85 A variety of data such as morphological, climate, land use and soil is required for the SWAT
 86 implementation. A Digital Elevation Model (DEM) with a spatial resolution of 5 m was used in order
 87 to delineate the watershed. The topographical data of the study area were provided by the National
 88 Cadastre and Mapping Agency S.A. of Greece. The land use of the study area is derived from the
 89 Corine Land Cover 2012 (<https://land.copernicus.eu/pan-european/corine-land-cover/clc-2012>). The
 90 results of the laboratory soil tests, which took place in the Laboratory of Engineering Geology &
 91 Hydrogeology of Aristotle University in Thessaloniki, were taken into consideration in order to create
 92 the soil map of the study area.

93 Daily precipitation, maximum and minimum air temperature, solar radiation, wind speed and
 94 relative humidity data are demanded as SWAT input climate data. In this study, the ERA-Interim
 95 reanalysis data with a spatial resolution of 12.5 km, which are publicly available by the European
 96 Centre for Medium-Range Weather Forecasts (ECMWF)
 97 (<http://apps.ecmwf.int/datasets/data/interim-full-daily/levtype=sfc>) were used to drive the SWAT
 98 model. In the framework of this paper, the ERA-Interim climate data cover the period from 1981 to
 99 2000.

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101 2.2.3 Model set up

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103 The simulation of the Havrias river basin was conducted by using the ArcSWAT interface for
 104 SWAT2012. The Havrias river basin was divided into 23 subbasins after the watershed delineation.
 105 The HRU definition was carried out by using the land use, the soil and the slope data. The land cover
 106 and the soil data were reclassified based on the SWAT model's specifications. Five slope classes were
 107 defined for the HRU classification. A threshold of 0%-0%-0% was set up for the land use, the soil type
 108 and the slope, respectively. Overall, 309 HRUs were created.

109 The Penman-Monteith method was implemented so as to estimate the potential
 110 evapotranspiration (PET). The surface runoff was computed by using the Soil Conservation Service's
 111 curve number (CN2) method. The SWAT model was initially run for the period from 1981 to 2000.

112 The calibration was accomplished by using the trial – and - error procedure.

113 The sensitivity analysis of the hydrological budget components to the variation of the climate
 114 parameters was carried out by using eleven hypothetical scenarios. Table 1 illustrates these scenarios
 115 which include different combinations of temperature, precipitation, wind speed and relative
 116 humidity. The land use remained stable during the simulation of the hypothetical scenarios.

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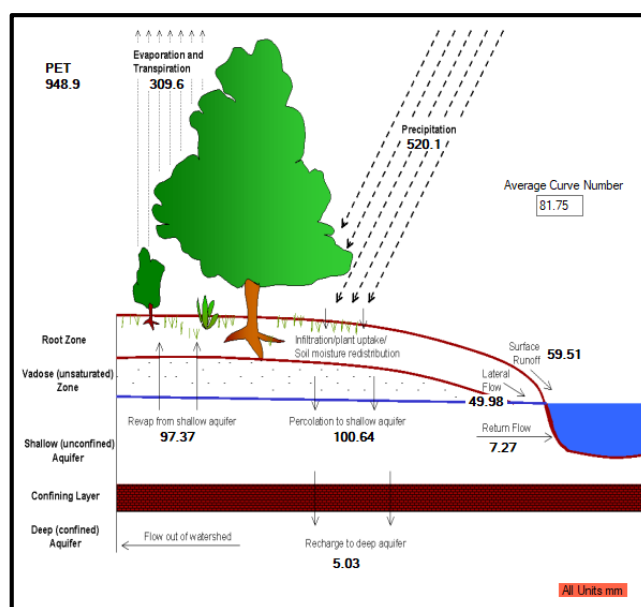
Table 1. The hypothetical climate scenarios.

Scenario	Temperature (°C)	Precipitation (%)	Wind speed (%)	Relative Humidity (%)
1	+1	0	0	0
2	+2.5	0	0	0
3	0	-5	0	0
4	0	-10	0	0
5	+2.5	0	+50	0
6	+2.5	-5	+50	0
7	+2.5	-5	+50	-25
8	+2.5	+5	+50	+10
9	0	+5	0	0
10	0	+5	0	+5
11	0	0	+50	0

123

124 **3. Results**125 *3.1. Hydrological budget components simulation*

126 Based on the SWAT simulation results regarding to the period from 1981 to 2000, the
 127 evapotranspiration was calculated equal to 309.6 mm, representing about the 60% of the mean annual
 128 precipitation (520.1 mm) of the Havrias river basin. The potential evapotranspiration was estimated
 129 equal to 949 mm. The percolation to shallow aquifer was estimated equal to 106.64 mm and the
 130 recharge to the deep aquifer equal to 5 mm. The surface runoff was computed at 59.51 mm. Figure 2
 131 comprehensively depicts the hydrological procedures of the Havrias river basin.



132

133 **Figure 2.** The hydrological procedures of the Havrias river basin for the period 1981-2000.134 *3.1.1. Hydrological budget components simulation under different hypothetical climate scenarios*

135 Table 2 demonstrates the SWAT simulation results of the water budget under different
 136 scenarios. The following results can be drawn from the Swat simulation of the Havrias river basin
 137 under the hypothetical climate scenarios:

- 138 • The temperature increase by 2.5 °C (Scenario 2) resulted in increase by 8% and 1.4% in potential
 139 evapotranspiration and in evapotranspiration, respectively. On the contrary, the percolation to
 140 the shallow aquifer and the recharge to the deep aquifer was decreased by 9.3%.
- 141 • Reducing and increasing the precipitation, reduced and increased all the hydrological
 142 components, respectively. No changes observed in the potential evapotranspiration.
- 143 • Increasing only the wind speed (Scenario 11) resulted in slight decrease in evapotranspiration,
 144 percolation and consequently in recharge.
- 145 • The largest increases of evapotranspiration and decreases of runoff and percolation obtained
 146 when all the climate parameters (temperature, precipitation, wind speed, relative humidity)
 147 were changed.
- 148 • Scenario 7 showed an augment by 59% and 13% in potential evapotranspiration and
 149 evapotranspiration, respectively, whereas a decrease by 50% and 11% in percolation and hence
 150 in recharge to deep aquifer and in surface runoff, accordingly.

151 **Table 2.** The SWAT simulated hydrological budget components under the different hypothetical climate
 152 scenarios.

Scenario	Potential Evapotranspiration (mm)	Evapotranspiration (mm)	Percolation (mm)	Surface Runoff (mm)
1981-2000	949	309.6	106.6	59.5
1	979	311.3	98.6	60.2
2	1024.5	314.0	96.2	60.3
3	949.0	299.1	93.9	53.2
4	949.0	289.4	86.3	47.7
5	1219.3	332.1	84.4	56.5
6	1219.3	321.9	77.6	50.3
7	1515.6	359.4	52.9	41.9
8	1143.9	350.2	54.6	61.5
9	949.0	316.9	108.7	66.9
10	900.8	321.1	106.0	66.0
11	949	308.2	101.2	59.8

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154 4. Discussion and Conclusions

155 A regional sensitivity analysis of the hydrological budget components of the Havrias river basin
 156 to the variations of the climate parameters was performed in this study. The sensitivity analysis
 157 showed that the Havrias river basin is vulnerable to the variability of the climate parameters. Based
 158 on the SWAT simulation results, the temperature, the precipitation and the relative humidity highly
 159 influence the hydrological budget components of the study area. In contrast, the wind speed has
 160 negligible role in hydrological processes. In accordance with the author's findings, Ficklin et al (2009)
 161 presented that the hydrological system of a highly agricultural watershed is sensitive to climate
 162 variability. According to their results, the changes in temperature highly influence on the
 163 hydrological components.

164 This paper is a preliminary research on the assessment of the sensitivity of the hydrological
 165 components to potential future climate change, laying the foundation for using the climate models
 166 outputs so as to quantify the climate change impacts on water resources. The couple of reliable
 167 climate and hydrological models is essential in order water managers to be able to build scenarios
 168 providing sustainability against the anticipated climate change.

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172 **Author Contributions:** Panagiota Venetsanou, collected and evaluated the data, and wrote the paper. Christina
173 Anagnostopoulou conceived the idea and evaluated the climate data. Athanasios Loukas contributed to the
174 application of the SWAT model. Konstantinos Voudouris coordinated and supervised the project.

175 **Conflicts of Interest:** The authors declare no conflict of interest.

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177 Abbreviations

178 The following abbreviation is used in this manuscript:

179

180 SWAT: Soil and Water Assessment Tool

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