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Article

# Combined Impacts of Climate Change and Water Withdrawals on the Water Balance at the Watershed Scale—The Case of the Allier Alluvial Hydrosystem (France)

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Abstract: The Allier River and its alluvial aquifer constitute a shallow but highly productive water resource due to their hydrodynamic properties. This hydrosystem provides almost all of the water requirements for domestic supply and irrigation. Recent dry summers (such as those in 2015, 2019, and 2022) and the lack of winter recharge have led managers to question the sustainability of this resource. We proposed the use of hydrological modelling with Gardenia with which the water balance can be determined at the watershed scale (7020 km<sup>2</sup>) and with which forecasting simulations can be performed for 2030-2070. Thus, this work was divided into (1) model calibration (2000-2020), (2) the determination of the main drivers of the water balance (2000-2020), (3) and river flow and groundwater level simulation (2030–2070). For the latter, Gardenia was used considering a "better case", using the RCM Aladin63 in RCP2.6, and considering a "worst case", using the RCM RegCM4-6 in RCP8.5. The calibration for 2000–2014 showed good reproducibility of river flows (NSE = 0.91) and groundwater levels (NSE = 0.85). The model showed that the major drivers in 2000–2020 were actual evapotranspiration and effective precipitation, which, respectively, represented 68% and 32% of mean annual precipitation. Water withdrawals did not significantly contribute to the water balance with the exception of those in very dry summers, such as those in 2003, 2005, 2015, and 2019. Climate appeared, therefore, as a prevalent factor of the Allier hydrosystem functioning compared to global withdrawals except for that during these dry years. Prospective simulations showed a decline in annual river flows and groundwater levels by a maximum of -15% and -0.08 m asl ("worst case"), respectively. These simulations showed that the Allier hydrosystem will be able to meet the water needs for various uses until 2070. In detail, it is likely that summer shortages will no longer be compensated by the Naussac Dam if the hydrosystem faces more than two years of drought. In this case, water-saving solutions will have to be found. This study is, thus, a good example of the application of hydrological modelling to address management issues in such a hydrosystem.

**Keywords:** hydrological modelling; alluvial hydrosystem; climate change; human pressure; water balance; forecast



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#### 1. Introduction

Quantifying the spatial and temporal variations of a water budget is essential for improving our understanding of the availability of water resources, the risk of hydrologic extremes such as floods and droughts, and the implications of climate change [1]. The water budget, or balance, is the inflow of water from precipitation and the outflow of water through evapotranspiration according to Thornthwaite and Mather (1957) [2]. The local annual water balance is controlled by the distribution over time of water supplies (e.g., precipitation) and demands (e.g., potential evapotranspiration) balanced by the storage of water in the root zone of the soil [3]. Although, there are different formulations,

it mostly depends on the scale of investigation, and, thus, the parameters to be considered can differ. At the watershed scale, it could be expressed as  $P = ETa + R \pm \Delta W \pm \Delta S$ , which is readapted from Hasenmueller and Criss (2013) [4], where precipitation (P) is distributed between actual evapotranspiration (ETa), runoff (R), and withdraws ( $\Delta W$ ) and is modulated by the changes in groundwater/soil water storage ( $\Delta S$ ). Precipitation constitutes, in general, the largest component in a water balance equation [5]. It can generate outflow through ETa or induce the direct recharge of groundwater through direct vertical percolation in the vadose zone [6]. Groundwater recharge is a strategic hydrologic variable that needs to be estimated for sustainable groundwater management, especially within the global warming context [7]. Anthropogenic water withdrawals are, most of the time, not considered in water balance assessments. They might be difficult to estimate at a large spatial scale. However, groundwater occupies a predominant role in sustaining human activities by being the world's largest distributed freshwater reservoir [8]. The UNESCO report [9] indicated that 69% of groundwater withdrawals are for the agricultural sector, 22% are for domestic uses, and 9% are for industrial purposes.

Many types of aquifers can be used around the continents [10]. Among them, alluvial formations are distinguished by their minor role in regional groundwater flow and by their large to very large groundwater storage capacity. Unconsolidated sand and gravel formations constitute the world's most easily accessible and most widely tapped aquifers. In France, alluvial aquifers also play a major role as they provide about 45% of France's groundwater use [11]. Among the socioeconomic activities requiring water, irrigation is a contributing factor in alluvial system vulnerability and groundwater level decreases [12–17]. Climate change is likely to amplify the water resource demands [18] and, thus, enhances the current alluvial groundwater depletion.

Worldwide, it has been reported in other studies that the piezometric level of alluvial aquifers is decreasing within various proportions:  $-5.6 \times 10^{-3}$  to -1.49 m/y in India [19] from 1996 to 2016, -0.2 m/y in Australia [20] from 1971 to 2021, and -1 m/y in China [21] from 1996 to 2022. Godwin et al. (2022) even reported drops in the piezometric level ranging from -5 m to -30 m in 2015 in Arkansas (US) [22]. Such as with groundwater, streamflow regimes have also been altered [23-28]. The impact of human activities on water resource decreases is, therefore, unequivocal. Thus, it is necessary to implement adapted methodologies to better understand the impact of natural and anthropogenic pressures on water resources, such as climate change and withdrawals, respectively. Conceptual or analytical approaches can be used [29], but hydrological modelling and rainfall-runoff models are still the most widely used methods [30–32]. The selection of an appropriate type of model is an important issue which depends on the availability, length, and quality of the hydrometeorological and geomorphological data at spatial scales of regular intervals [29]. The choice of an adequate model is complex, as there are different categories and subcategories. According to Lee et al. (2005) [33], there is no evidence of a relationship between catchment type and a preferred model structure. Khakbaz et al. (2012) [34] used different calibration strategies and concluded that lumped calibration performed better than distributed calibration. Thus, the choice of a perfect model does not exist, and one must adapt to the available dataset and the objectives of the study that is being carried out.

On the one hand, there are physically based models whose structures depend on the spatial distribution and variation of physical parameters, such as the MIKE SHE [35,36], the HydroGeoSphere [37,38], and the SWAT [39,40] models. The latter requires spatially distributed data, such as the digital elevation model (DEM), the land cover and uses, soil properties, and climate data (precipitation, air temperature, solar radiation, and others). On the other hand, there are indeed conceptual and lumped models designed to approximate within their structures the general physical mechanisms which govern the hydrological cycle [41]. In the present category, the TOPMODEL [42,43], the HBV [44,45], and the GR4J [46,47] models can be mentioned. Based on reservoir modelling, they are less demanding in data input and are mostly based on averaged precipitation and air temperature to determine potential evapotranspiration. This very brief review of the main models is

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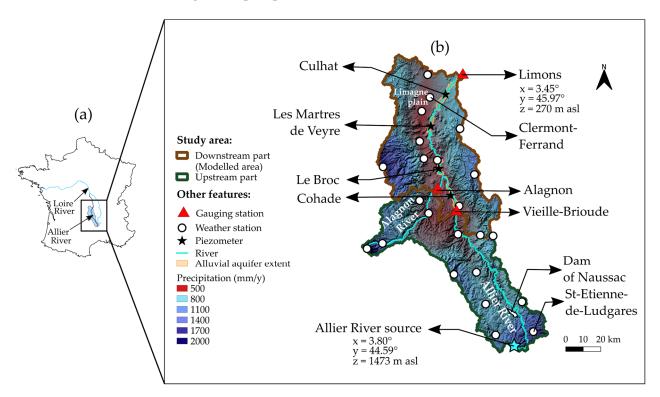
not exhaustive but shows that the range of possibilities is large. The final choice is then mainly ruled by the available amount and the variety of data. In this study, the conceptual model Gardenia [48,49] was chosen. Indeed, it allows one to model the river flows at the watershed's outlet and groundwater levels based only on the precipitation and potential evapotranspiration data. It has the advantages of considering the water cycle as a whole (from precipitation, groundwater recharge, runoff, and withdrawals to the river outflow) and being calibrated based on a reasonable number of parameters (8 to 10). However, Gardenia only requires one record for each hydrological parameter, which led us to use methods to average them at the scale of the study area.

Such a model can be easily applied to any alluvial watershed, and it allowed us to determine the main factors driving the water balance and the projected evolution of water availability in a climate change context. In this framework, the present study focused on the Allier hydrosystem (i.e., the Allier River and its alluvial aquifer), which constitutes a major regional water resource supplying different uses (domestic water and irrigation mostly) and which faces an increasing water demand and a regular decrease in recharge.

### 2. Materials and Methods

## 2.1. Description of the Study Area

The whole Allier River Watershed covers a surface of 14,310 km² in Central France [50]. The Allier River's source is to the south of the catchment at 1473 m asl, and it flows towards the Loire River. The present study focused on the southern part of this watershed, which covers an area of 7020 km² (Figure 1a) from the river source to Limons (270 m asl), which is considered to be the outflow point (Figure 1b). It is characterized by a contrasted distribution of elevation levels varying between 1700 and 270 m asl, thus generating heterogeneous precipitations fields.



**Figure 1.** (a) Location of the Allier River, the Loire River, and the Southern Allier River Watershed in France. (b) Merged maps of elevation levels and distribution of mean annual precipitation in the study area (Météo-France, 2000–2020).

The south of the catchment and all the reliefs surrounding the Limagne rift receive higher quantities of precipitation, from 800 to 1600 mm/y, sometimes exceeding 2000 mm/y.

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On the contrary, the Limagne plain is known to be deficient, with mean precipitation limited to 500–600 mm/y [51]. In addition, this parameter changes with time. For example, at the station of Clermont–Ferrand, the yearly precipitation sum is  $570 \pm 90$  mm/y (averaged over 2000–2020), with an observed minimum of 380 mm in 2015 and a maximum of 735 mm in 2008. Annual mean air temperatures also vary depending on the elevation:  $12.1 \pm 0.7$  °C in Clermont–Ferrand versus  $8.3 \pm 0.8$  °C in St-Etienne-de-Ludgares (averaged over 2000–2020).

The hydrological regime of the Allier River is, thus, subject to both intense floods and severe droughts in summer. At Limons, the daily mean river discharge is  $70~\text{m}^3/\text{s}$  (1974–2020), which ranges between a minimum of  $2.8~\text{m}^3/\text{s}$  observed on 08/06/1975 and a maximum of  $1120.0~\text{m}^3/\text{s}$  observed on 12/04/2003. In 1983, the Naussac Dam, located near the Allier River source (Figure 1b), was built to ensure a minimum discharge into the Allier River. One of its purposes is to ensure a minimum discharge into the Allier River so that the nuclear power plants, located downstream of the Loire River, have enough water to cool their reactors. This dam consists of a reservoir lake of  $190 \times 10^6~\text{m}^3$  at the maximum of its capacity that must guarantee a minimum flow of  $6~\text{m}^3/\text{s}$ . It takes approximatively two years of precipitation to fully recharge this dam.

Regarding its global geology, the upstream part of the study area (Figure 1b) is made of crystalline rocks presenting with very low permeability. It is drained by the Allier River and its main tributary, the Alagnon River. The downstream part is dominated by the Limagne rift, an elongated tectonic depression within the Hercynian crystalline massif [52]. This Oligocene graben favored the setting of the Allier alluvial aquifer [53], which consists of an unconfined alluvium layer with a 10–15 m depth and a 0.1 m to 3–4 km width.

The land use is mainly occupied by grasslands and forests in the upstream part, while, within the Limagne rift, flatter elevation levels have favored an important urban and agricultural development that benefits from the presence of fertile lands and the availability of superficial and groundwater resources. Indeed, the Allier River supplies water for almost all agricultural needs (92%), and its alluvial aquifer supplies water for 60% of domestic water uses.

Hence, there are noticeable contrasts (in topography, climatology, geology, and land uses) between the upstream and downstream part of the study area (Figure 1b). Thus, we aimed to analyze the hydrological and anthropogenic parameters (from 2000 to 2020) of these two areas, separately. Hydrological modelling with Gardenia was carried out on the downstream part, where the Allier hydrosystem is located.

#### 2.2. Available Data on the Study Area

Several climatic and hydrological data collected in the study area have been used, such as precipitation, air temperature, river flows, groundwater levels, and water withdrawals for the different uses (domestic, irrigation).

The longest precipitation and air temperature datasets were recorded from 1974 to 2020 in Clermont–Ferrand (x = 3.15, y = 45.79, and z = 331 m asl) for temperature and in St-Etienne-de-Ludgarès (x = 3.95, y = 44.65, z = 1022 m asl) for precipitation. For the gauging stations of the Allier River, it is also possible to go back to 1974 in Vieille-Brioude and Limons. The more recent period of 2000–2020 is better documented, and the following data were collected (Table 1): (1) daily precipitation and air temperature from 23 weather stations distributed along the entire watershed, (2) daily river flows from three gauging stations installed on the Allier River watercourse in Vieille-Brioude and in Limons ( $Q_{VB}$  and  $Q_{LIMONS}$ ) and on the Alagnon River ( $Q_{ALGN}$ ), (3) daily discharges of the Naussac Dam ( $Q_{NAUSS}$ ), (4) water withdrawals for domestic and irrigation uses, and (5) groundwater levels at four locations between 2007 and 2020 (Figure 1b). We focused on data from three available piezometers located close to Culhat and at different distances from the Allier River (see P40-07, P40-08, and P40-09 in Figure A1).

 $Mm^3/y$ 

 $m^3/s$ 

•	1 0 1		•	
Parameters	Units	Timestep	Source	Time Period
Precipitation (P)	mm	Daily	Météo-France	2000–2020
Air temperature (Ta)	°C	Daily	Météo-France	2000-2020
River flow rate (Q)	$m^3/s$	Daily	Hydroportail	2000-2020
Piezometric level (H)	m asl	Daily	ADES	2007-2020
Abstraction $(Q_W)$	$Mm^3/v$	Yearly	EPLoire	2000-2019

Daily

BNPE/AELB

2000-2020

**Table 1.** List of collected data together with their sources (internet access links are provided in the Data Availability Statement), units, sampling timesteps, and available time periods.

Water withdrawal data included domestic and irrigation supplies expressed as volume per year. Domestic supply was assumed to be constant throughout the year; we then divided the annual volume by 365 and reported an equal volume of withdrawal each day. Irrigation occurred from April to September in the following proportions: 2% in April, 2% in May, 12% in June, 51% in July, 32% in August, and 1% in September. The annual volume was, thus, distributed daily over these six months and was reported each day according to the previous percentages.

The Naussac Dam's water releases were naturally included in the incoming Allier River discharge in Vieille-Brioude (Figure 1b). They were, thus, considered in the model and in the forecast section of this work. As mentioned before, a purpose of the Naussac Dam is to ensure a minimum river flow at several control points, such as in Vieille-Brioude, where the dam must guarantee a flow of 6 m<sup>3</sup>/s at least. This was also considered in the forecast section. In the model, we assume that the dam would be able to provide a flow of 6 m<sup>3</sup>/s in Vieille-Brioude during the considered period (2030–2070).

A list of the main used abbreviations is provided in Table A1.

## 2.3. Description of the Hydrological Model Gardenia

Abstraction (Q<sub>W</sub>)

Dam discharge (Q<sub>NAUSS</sub>)

Gardenia is a conceptual model that has already demonstrated its effectiveness in simulating and forecasting river flows and groundwater levels for watersheds of different sizes over varying periods of time [54-57]. It simulates the main mechanisms of the water cycle, precipitation (P), actual evapotranspiration (ETa), runoff (R), and groundwater recharge (GWR), using simplified physical laws which are translated into flows through a succession of reservoirs (Figure 2, [49]). The reservoir (S) represents the first 10 cm of the soil affected by evapotranspiration processes. Effective precipitation (P<sub>EFF</sub>) depends on the capacity of reservoir (S) according to quadratic laws (1) and (2):

If 
$$P > PET$$
, then  $P_{EFF} = (P - PET) \times Satur^2$  (1)

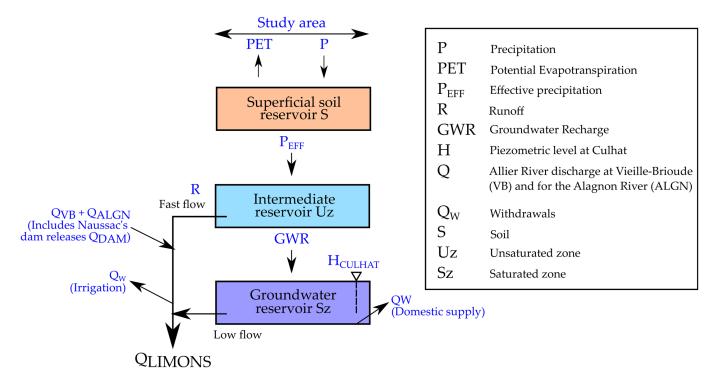
If 
$$P < PET$$
, then  $ETa = (PET - P) \times Satur \times (2 - Satur)$  (2)

where Satur is the reservoir (S) saturation level. Then, P<sub>EFF</sub> supplies the unsaturated zone reservoir (Uz). P<sub>EFF</sub> is distributed into R and GWR depending on the distribution height of the runoff-infiltration parameter (H<sub>R-I</sub>, Table 2). R supplies the superficial flow, and GWR supplies the groundwater reservoir (Sz) (for saturated zone). Finally, the simulated parameters are the groundwater level H of Sz and the total river discharge Q at the outlet of the watershed. H<sub>CULHAT</sub> and Q<sub>LIMONS</sub> are indicated in Figure 2, Q<sub>LIMONS</sub> being the addition of the R component and the drainage of Sz.

The parameterization of the model requires the daily average of precipitation over 2000–2020, which is representative of the watershed. The latter can be obtained with geostatistical (such as kriging) or deterministic methods. The most frequently used deterministic methods are the Thiessen polygon and inverse distance weighting (IDW) [58]. As Gardenia requires a single record for each input parameter (Table 1), precipitation was averaged using the Thiessen polygon method for the twelve stations located on the upstream part and for the eleven stations on the downstream part (Figure 1b). Although kriging method usually leads to increased accuracy, it has the disadvantage of mainly relying on the assumption

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of stationarity in the means [59]. Moreover, Ruelland et al. (2008) [60] compared different interpolation methods for precipitation in a lumped model; all approaches (Thiessen polygon, IDW, spline and kriging) led to a similar fitting between observed and simulated values of the river flow. Hence, the straightforward method of Thiessen polygon to average precipitation over 2000–2020 was chosen.



**Figure 2.** Functional scheme of the reservoir model Gardenia, which was adapted from Thiéry (2014) [49].

**Table 2.** Optimized parameters in Gardenia and their descriptions: soil reservoir capacity  $S_{RES}$ , distribution height of runoff–infiltration  $H_{R-I}$ , underground exchange factor  $F_{EXCH}$ , flow delay time  $F_D$ , half infiltration time of the water table  $I_{I}$ , half drying time of groundwater flow  $I_{I}$ , groundwater base level  $I_{BF}$ , and storage coefficient  $I_{COEFF}$ .

Parameters	Units	Description
S <sub>RES</sub>	mm	Water capacity of the soil layer.
H <sub>R-I</sub>	mm	Water height that leads to an equal distribution of the fast flow (R) and of the low flow (GWR).
F <sub>EXCH</sub>	%	The model is allowed to export/import flow to/from reservoir Sz.
$\overline{F_{D}}$	days	Delay between the emptying of Uz and Sz until it reaches the outlet.
Infiltr <sub>1/2</sub>	month	Time between a $P_{\text{EFF}}$ reaction and an increase in the low flow component of the groundwater reservoir.
Dry <sub>1/2</sub>	month	Time upon which, when no GWR occurs, the groundwater flow is divided by two.
$G_{BF}$	m asl	Level that would be reached after an infinite time with no GWR.
S <sub>COEFF</sub>	%	Storage coefficient of the aquifer.

The daily mean air temperature was calculated by averaging data from the twelve weather stations on the upstream part and the eleven on the downstream part. Potential evapotranspiration was calculated from this averaged value using the Oudin method [61].

Calibration is a semiautomatic process. The user gives for each optimized parameter (Table 2) (1) an initial value for the first run and (2) a range with a lower and an upper limit. In order to test and validate the model, the river flow in Limons was calibrated using

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2000–2014 data and was validated using 2015–2020 data. Similarly, the groundwater levels in Culhat were calibrated using 2010–2016 data and were validated using 2017–2020 data.

The first simulated timesteps strongly depend on the previous ones. The period of 1998–1999 was, thus, used as a "warm-up" period for the river flow simulation, and 2007–2009 was used for the groundwater level simulation. To assess the ability of the model to reproduce measurements, the Nash–Sutcliffe efficiency criterium (NSE) (3) [62] was used:

$$NSE = 1 - \frac{\sum_{t=0}^{T} (Q_t - q_t)^2}{\sum_{t=0}^{T} (Q_t - \overline{Q})^2}$$
 (3)

where  $Q_t$  and  $q_t$  are, respectively, the observed and modeled flow at time t and where  $\overline{Q}$  is the mean of the observed flows. It ranges between  $-\infty$  to 1, 1 being a perfect fit. During the calibration process, a weighting was applied to the square root of the flows. Biases on river flows (Qbias) and groundwater levels (Hbias) was determined using (4):

Bias 
$$(m^3/s \text{ or m asl}) = Sim\_Avg - Obs\_Avg$$
 (4)

where Sim\_Avg and Obs\_Avg are, respectively, the simulated and observed averages for the full simulation period.

2.4. Regional Climate Model (RCM) and Representative Concentration Pathway (RCP) Scenarios for Forecasting the River Discharge and Groundwater Levels

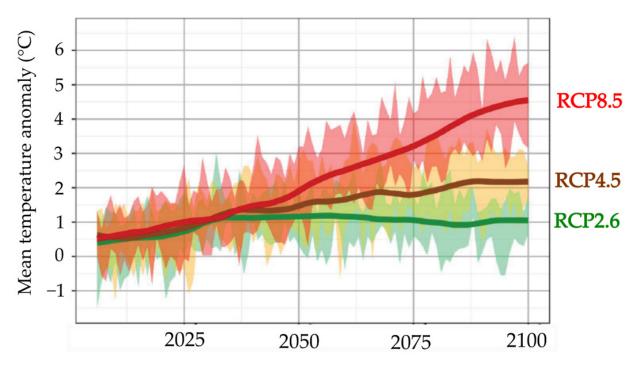
A common purpose of every groundwater or hydrological model in general is to forecast the effect of some future action (evolution of water withdrawals for instance) or hydrologic condition (such as climate change) [63]. To achieve this goal, the calibrated model is forced using climatic data that were part of the new set of regionalized climate projections, DRIAS-2020, from the Euro-Cordex project [64]. Air temperature (°C) and precipitation (mm/d) for 2030–2070 were extracted for the downstream part of the study area (Figure 1b) considering "best case" and "worst case" scenarios. The former implied the RCM Aladin63\_CNRM-CM5, which was associated with the emission scenario RCP2.6. The latter implied the RCM RegCM4-6\_HadGEM2, which was associated with RCP8.5. Indeed, in comparison to the yearly mean air temperature reference "Ref" of 11.5° C (Table 3), the RCM Aldadin63 in RCP2.6 was moderate in terms of climate change with a very similar yearly mean air temperature of 11.3 °C. On the contrary, the RCM RegCM4-6 in RCP8.5 involved an increase of 1.05 °C over 2030–2070 [65]. Furthermore, RCP2.6 was the most optimistic emission scenario, and it resulted in a stabilization of air temperature anomalies around year 2100 in France. In the case of the RCP8.5 scenario, the absence of regulation of man-made greenhouse gases leads to a gradual increase in temperature anomalies until year 2100 (Figure 3).

**Table 3.** Yearly mean of air temperature (°C) and precipitation sums (mm/y) averaged over 2030–2070 for the defined "best case", RCM Aladin63 in RCP2.6, and for the "worst case", RegCM4-6 in RCP8.5, based on collected data from DRIAS-2020. They all refer to the downstream part of the study area (Figure 1b) compared to values obtained for the reference period "Ref": 2000–2020.

Parameter	Ref	RCM Aladin63 RCP2.6	RCM RegCM4-6 RCP8.5
Air temperature (°C)	11.50	11.30	12.55
Precipitation (mm/y)	770	909	886

The use of two couples of contrasted RCM-RCPs allowed us to give a range of potential evolution of the Allier River outlet discharge (Limons) and of the groundwater levels (Culhat). The analysis of the forecasted  $Q_{LIMONS}$  and  $H_{CULHAT}$  for 2030–2070 was compared to the reference (2000–2020 for  $Q_{LIMONS}$  and 2007–2020 for  $H_{CULHAT}$ ).

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**Figure 3.** Evolution of the mean air temperature anomaly (°C) in France for RCP 2.6, RCP 4.5, and RCP 8.5, adapted from Valérian et al. (2022) [64].

The work presented in this article was, thus, divided in four steps: (1) a preanalysis of the data to characterize the evolution trends of hydrometeorological parameters and water withdrawals, (2) the calibration of the hydrological model Gardenia based on the collected data (Table 1) and the optimized parameters (Table 2), (3) the quantification of the water balance components for 2000–2020 resulting from the data preanalysis and from the model, and (4) the forecast of Q<sub>LIMONS</sub> and H<sub>CULHAT</sub> for 2030–2070.

# 3. Results and Discussion

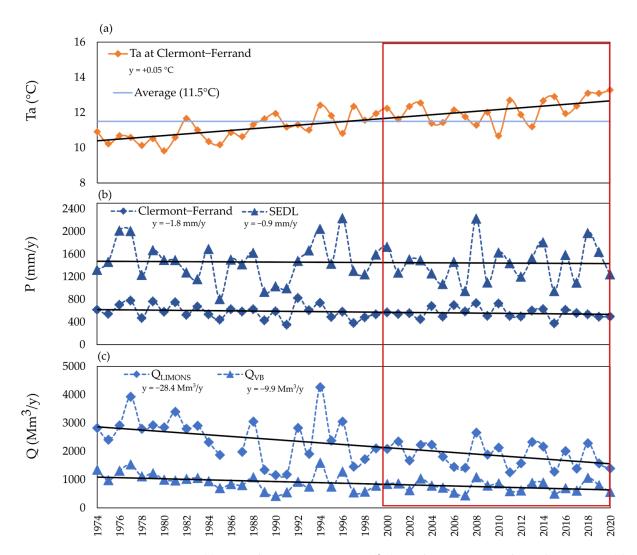
3.1. Identification of the Driving Factors using the Observation Data

# 3.1.1. Trends in 1974-2020

To compare this study with a more global trend, we investigated the evolution of the climatic (precipitation and air temperature) and hydrologic (river flows, withdrawals, and dam releases) data from the long-term records of 1974–2020. The interannual mean air temperature (1974–2020) in Clermont–Ferrand was 11.5  $\pm$  0.9 °C, while the values after the 2000s were more often above that mean (Figure 4a). The temperature has gradually increased by +0.05 °C/y since 1974, which corresponded to an increase of 2.3 °C over 46 years. The interannual precipitation mean (1974–2020) was 580  $\pm$  110 mm/y in Clermont–Ferrand and was 1450  $\pm$  340 mm/y in St-Etienne-de-Ludgarès (SEDL, Figure 4b). The standard deviations showed that the interannual variability was greater in SEDL than in Clermont–Ferrand and of -0.9 mm/y in SEDL; that is to say there was a decrease of 83 mm and of 41 mm over 46 years, respectively.

Figure 4c shows the total annual river discharge (Mm $^3$ /y) flowing through Limons and Vieille-Brioude. In accordance with its downstream position in the watershed, higher discharges were monitored in Limons, with an interannual mean of 2210  $\pm$  720 Mm $^3$ /y versus that of 860  $\pm$  280 Mm $^3$ /y in Vieille-Brioude. A decreasing trend could also be seen:  $-28.4 \, \text{Mm}^3$ /y in Limons and  $-9.9 \, \text{Mm}^3$ /y in Vieille-Brioude. This means that the Allier River discharge decreased by approximatively 30% between 1974 and 2020.

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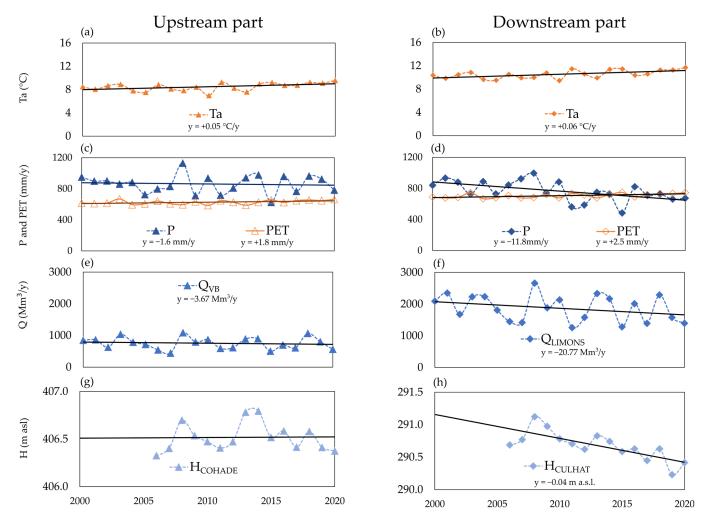


**Figure 4.** (a) Annual air temperature Ta ( $^{\circ}$ C) at Clermont–Ferrand weather station, (b) annual precipitation P (mm/y) at Clermont–Ferrand and St-Etienne-de-Ludgarès (SEDL) weather stations, (c) annual discharge volume Q (Mm³/y) measured by the gauging stations of Limons (Q<sub>LIMONS</sub>) and Vieille-Brioude (Q<sub>VB</sub>). The red frame indicates the modelling period (2000–2020).

# 3.1.2. Observed Trends during the Modelling Period: 2000–2020

In this subsection, the observations made for the upstream and downstream parts of the study area (Figure 1b) are distinguished. The upstream and downstream parts presented, respectively, a mean annual air temperature of  $10.5\pm0.7\,^{\circ}\text{C}$  and  $8.5\pm0.7\,^{\circ}\text{C}$  and a mean annual precipitation sum of  $770\pm130\,\text{mm/y}$  and  $860\pm120\,\text{mm/y}$ . If air temperatures increased similarly in both locations, with a gradient of  $+0.05\,^{\circ}\text{C/y}$  and  $+0.06\,^{\circ}\text{C/y}$ , respectively (Figure 5a,b), the evolution of the other studied parameters would be more moderate for the upstream part compared to the downstream part.

Indeed, precipitation presented a decreasing gradient of  $-11.8 \, \text{mm/y}$  for the down-stream part versus  $-1.6 \, \text{mm/y}$  for the upstream part (Figure 5b,c). The potential evapotranspiration increased by  $+2.5 \, \text{mm/y}$  and by  $+1.8 \, \text{mm/y}$  for the downstream and upstream parts, respectively. According to Brulebois et al. (2015) [66], an increase in air temperature results in an increase in actual evapotranspiration and, consequently, in a decrease in runoff. This seemed to be the case for the downstream part of the study area (Figure 5b,d,f) but not for the upstream basin, which exhibited a greater stability of these parameters (Figure 5a,c,e).

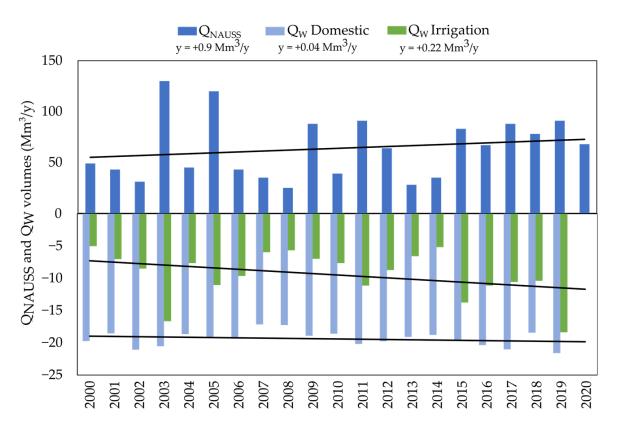


**Figure 5.** Evolution from 2000 to 2020 for the upstream and downstream parts of the study area (as defined in Figure 1) of  $(\mathbf{a},\mathbf{b})$  mean annual air temperature Ta (°C),  $(\mathbf{c},\mathbf{d})$  annual precipitation P, potential evapotranspiration sum PET (mm/y),  $(\mathbf{e},\mathbf{f})$  mean annual discharge of the Allier River in Limons  $(Q_{LIMONS})$  and Vieille-Brioude  $(Q_{VB})$  (Mm<sup>3</sup>/y), and  $(\mathbf{g},\mathbf{h})$  mean annual groundwater levels H of the alluvial aquifer (m asl) in Cohade  $(H_{COHADE})$  and in Culhat  $(H_{CULHAT})$ .

 $Q_{VB}$  was quite constant (Figure 5e) just like the groundwater level  $H_{COHADE}$  close to it (Figure 5g). A decrease in the  $Q_{LIMONS}$  could be observed ( $-20.7~Mm^3/y$ , Figure 5f). Similarly, the alluvial water table  $H_{CULHAT}$  had a downward trend of -0.04~m asl/y from 2007 to 2020 (Figure 5h), corresponding to a decrease of -0.52~m over 13 years. Hence, there were spatial heterogeneities in the observed trends along the alluvial aquifer. Indeed, at the scale of the study area, it seemed that the largest hydrological parameter decreases were recorded in Limons.

Figure 6 illustrates the evolution of the annual discharge of the Naussac Dam ( $Q_{NAUSS}$ ) into the Allier River (injections were positive values) and the annual volumes withdrawn for domestic and irrigation supplies ( $Q_W$ , negative values). Water withdrawals for domestic supplies were quite constant with a mean of  $19.4 \pm 1.2 \, \text{Mm}^3/\text{y}$  between 2000 and 2020. They were characterized by a slight increase of  $+0.04 \, \text{Mm}^3/\text{y}$ . Withdrawals for irrigation were more variable from one year to another but also tended to increase by  $+0.22 \, \text{Mm}^3/\text{y}$ .

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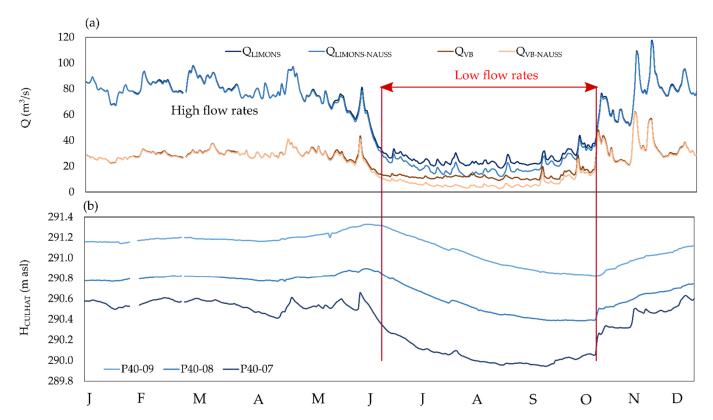
**Figure 6.** Annual volume of water injected into the river by the Naussac Dam ( $Q_{NAUSS}$ ) and annual volume of water withdrawn for domestic supplies and irrigation ( $Q_W$ ), all expressed in Mm<sup>3</sup>/y. The trend lines are given for each presented component.

Moreover, we observed a recurrence of years with more intense summer droughts; that was the case for the years 2003, 2005, 2011, 2015, and 2019. These droughts were mainly characterized by an increased volume of withdrawals for irrigation and dam releases (Figure 6) and by a decrease in precipitation. However, for the latter, some discrepancies were noted between the upstream and downstream parts of the study area. The drought of 2003 for instance, was characterized by a drop in precipitation in the downstream part (Figure 5d) but not in the upstream part (Figure 5c). On the contrary, during the 2015 drought, a decline in precipitation was clearly observed in both parts of the watershed. The effect of this lack of precipitation did not always result in a decrease in the mean annual river flow in Limons (as in 2003) because this intense low-flow period was followed by a major flood (observed peak flow of 1120 m³/s). Therefore, the contribution of the upstream and downstream parts to the observed river flow at the outlet in Limons could considerably vary in time, and the origin of the droughts could be multifactorial (on the interannual scale).

 $Q_{\rm NAUSS}$  also tended to increase in 2000–2020. To cite an extreme case, in 2003, 130 Mm<sup>3</sup> were released by the dam. This means that almost 70% of the dam reservoir lake was emptied to support the streamflow versus the drought.

# 3.1.3. Subannual Variations

Figure 7 reports the subannual values of  $Q_{LIMONS}$ ,  $Q_{VB}$  (Figure 7a), and  $H_{CULHAT}$  (Figure 7b) for three piezometers (P40-09, 08, and 07) whose locations are represented in Figure A1. This figure represents the mean distribution of the daily river flows in Limons, Vieille-Brioude, and the groundwater levels in Culhat over a year (averaged for 2000–2020 for the flows and for 2007–2020 for the levels).



**Figure 7.** (a) Distribution of the Allier River's flow rates ( $m^3/s$ ) over a year, which was averaged on a daily basis from 2000 to 2020 in Vieille-Brioude ( $Q_{VB}$ ) and Limons ( $Q_{LIMONS}$ ), from which Naussac Dam's daily releases were subtracted ( $Q_{VB-NAUSS}$  and  $Q_{LIMONS-NAUSS}$ ), (b) distribution of the groundwater levels (m asl) over a year, which was averaged on a daily basis from 2007 to 2020, for three piezometers in Culhat ( $H_{CULHAT}$ ).

The distribution of  $Q_{LIMONS}$  showed an important difference between the high (73 m<sup>3</sup>/s) and low flows (31 m<sup>3</sup>/s) in Figure 7a. During the summer, the reduced difference between  $Q_{VB}$  and  $Q_{LIMONS}$  indicated that the Allier River flow mainly originated from the upstream part of the study area. During the winter, it was the opposite, with a higher contribution of the downstream part to  $Q_{LIMONS}$ .

Thus, looking at the subannual scale, the hydrology of the Allier Watershed was characterized through a nivo–pluvial regime, with high flows in the autumn and spring due to abundant rainfall which were accentuated in the spring by the snowmelt [67,68]. To emphasize the importance of  $Q_{NAUSS}$  during low waters, the river flow in Limons and Vieille-Brioude was subtracted by  $Q_{NAUSS}$  ( $Q_{LIMONS-NAUSS}/Q_{VB-NAUSS}$ ). In the summer,  $Q_{VB}$  was almost exclusively supplied by  $Q_{NAUSS}$ , while  $Q_{NAUSS}$  contributed to around 50% of the observed  $Q_{LIMONS}$ . This highlighted that during the average summer, the observed river flow at the outlet was more dam-dominated than natural.

The strong seasonality of the Allier River flow was also noticeable in groundwater levels such as  $H_{\text{CULHAT}}$  (Figure 7b). Furthermore, we observed a decreasing level of  $H_{\text{CULHAT}}$  towards the Allier River (Figure A1), indicating that the alluvial aquifer supplies the Allier River. P40-07 was the piezometer where contrasts between high and low flows were more pronounced, which was similar to the river flow pattern reflecting the equilibrium between the river and the aquifer.

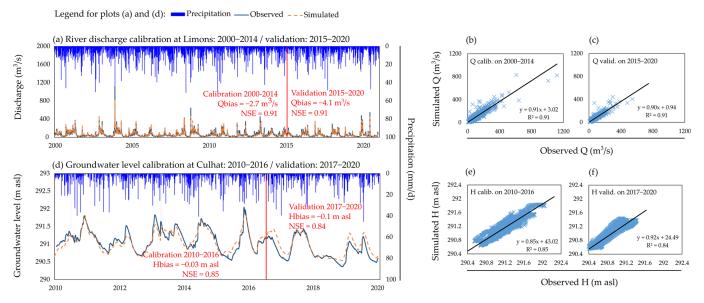
The analysis of the hydrometeorological data of the last 20 years allowed us to identify the forces that the Allier hydrosystem was facing, particularly on its downstream part (Figure 5b,d,f,h): (1) air temperatures increasing by 0.06 °C/y and, thus, potential evapotranspiration increasing by 2.5 mm/y; (2) withdrawals for irrigation increasing by 0.22 Mm $^3$ /y; (3) river flows at the watershed outlet in Limons decreasing by  $-20.8 \, \text{Mm}^3$ /y along with groundwater levels at specific locations, such as Culhat (Figure 5h); and (4) a

crucial contribution of the Naussac Dam during the summers (Figure 7a). In the following section, the hydrological model Gardenia was used to discriminate the factors controlling the Allier hydrosystem water balance and to simulate their evolution according to global changes.

# 3.2. Quantification of the Driving Factors of the Water Balance from 2000 to 2020

# 3.2.1. Calibrated Model and Parameters

The calibration of the model was performed on a daily timestep for Q<sub>LIMONS</sub> from 2000 to 2014 (Figure 8a) and for H<sub>CULHAT</sub> from 2010 to 2016 (Figure 8b). Gardenia was effective in reproducing the Q and H patterns of the river and the alluvial aquifer, with a NSE of 0.91 and 0.85, respectively. The calculated biases on the calibration period were small:  $-2.7 \,\mathrm{m}^3/\mathrm{s}$  for  $\mathrm{Q_{LIMONS}}$  and  $-0.03 \,\mathrm{m}$  asl for  $\mathrm{H_{CULHAT}}$ . Figure 8b,e illustrate the good correlation between the observed and simulated values, with an R<sup>2</sup> of 0.91 for Q<sub>LIMONS</sub> and 0.85 for H<sub>CULHAT</sub> over the calibration period. The river flow simulation over the validation period of 2000-2014 (Figure 8a,c) for Q<sub>LIMONS</sub> had an unchanged NSE of 0.91 and a Qbias of  $-4.1 \text{ m}^3/\text{s}$ . Then, the validation period of 2017–2020 for  $H_{\text{CULHAT}}$  had an NSE of 0.84 and an Hbias with a value of -0.1 m asl (Figure 8d,f). Hence, the model was more efficient in simulating the river flows than the groundwater levels. Several reasons could be given, such as the duration of the calibration period was smaller for the groundwater levels than for the flows, because of data availability. Moreover, there were more calibration parameters dedicated to optimizing the river flow than the groundwater levels (Table 2). Those elements might lead to a better fit in the river flow simulation than the groundwater levels.



**Figure 8.** (a) Evolution of the simulated vs. observed Allier River discharge (m<sup>3</sup>/s) in Limons with the corresponding correlation plots considering a calibration using (b) 2000–2014 timestep and (c) a validation using 2015–2020 timestep; (d) evolution of the simulated vs. observed groundwater levels in Culhat (m asl) with the corresponding correlation plots considering a calibration using (e) 2010–2016 timestep and (f) a validation using 2017–2020 timestep. In (a,d), precipitation (mm/d) was determined for the downstream part (Figure 1b) of the study area.

Furthermore, some misfits were noticed, especially for the flood periods of  $Q_{LIMONS}$ . This could be due to the applied weighting that was aimed at minimizing the deviations in the square root of the flows, which favored low waters. The set of parameters that allowed us to obtain this calibration is shown in Table 4.

Parameter	Unit	Initial Value	Min	Max	Calibrated Value
S <sub>RES</sub>	mm	250	0	650	131.5
$H_{R-I}$	mm	70	1	9999	48.6
$F_{EXCH}$	%	0	-70	80	-31.0
$F_{D}$	day	0	0	10	2.2
Infilt <sub>1/2</sub>	month	0.5	0.05	10	0.05
$Dry_{1/2}$	month	2	0.05	15	0.36
$G_{BF}$	m asl	0	-	-	290.5
S <sub>COEFF</sub>	(%)	10	1	30	1.6

Table 4. Post-calibration of the optimized parameters and their adjustment ranges.

Different ranges of variations were tested for each optimization parameter. The parameters presented in Table 4 allowed the best river flow and level fit (Figure 8). The soil capacity ( $S_{RES}$ ) and the distribution height of the runoff–infiltration parameter ( $H_{R-I}$ ) were particularly important, as they controlled the production of effective precipitation. Regarding the simulated  $H_{CULHAT}$ , the optimized storage coefficient of 2% was coherent with an unconfined aquifer type, which was the case for the Allier's alluvial aquifer.

Figure 8a,d also illustrate the precipitation records used as input data in the Gardenia model. Some floods observed in Limons resulted from important precipitation events occurring in the upstream part of the study area and caused an increase in inflow in Vieille-Brioude, which was, thus, reflected in Limons. Indeed, there were often precipitation events that did not necessarily lead to river floods or groundwater level increases in the downstream part. Moreover, some precipitation events occurred in the summer, and they may not have been effective precipitation events due to higher evapotranspiration rates.

# 3.2.2. Water Balance in the Downstream Part from 2000 to 2020

The observed precipitation values  $Q_{VB}$  and  $Q_{LIMONS}$  were derived from the preanalysis in Section 3.1. The model calibration allowed us to specify the actual evapotranspiration and effective precipitation rates. The latter was divided into runoff and groundwater recharge. In the Gardenia model scheme, the water fluxes that were not distributed between ETa or GWR supplied the R component (Figure 2).

The water budget represents the resource stability and availability at the watershed scale. Considering the downstream part of the study area, the following formula could be written (5):

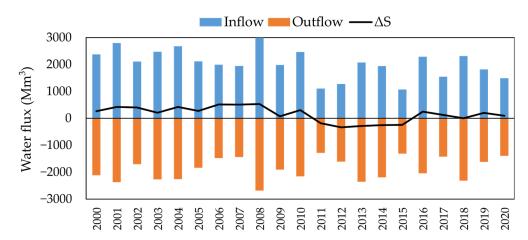
$$Q_{\rm IN} + P_{\rm EFF} = Q_{\rm OUT} \pm \Delta S \tag{5}$$

Thus: 
$$\Delta S = Inflows (Q_{IN} + P_{EFF}) - Ouflows Q_{OUT}$$
 (6)

with  $Q_{IN}$  being the sum of  $Q_{VB}$  and  $Q_{ALGN}$  and with  $Q_{OUT}$  being the sum of  $Q_{LIMONS}$  and the water withdrawals  $Q_W$  (domestic supply + irrigation). The difference between the rates of water flowing in and out of an accounting unit was balanced by the change in the water storage  $\Delta S$  (6) [69]. Figure 9 thus illustrates the total inflows, outflows, and  $\Delta S$  at the downstream basin scale. Inflows decreased at a rate of  $-45 \, \mathrm{Mm}^3/\mathrm{y}$  in the modelling period of 2000–2020.

ETa (570  $\pm$  50 mm/y) and P<sub>EFF</sub> (250  $\pm$  100 mm/y) were realistic compared to the previous results obtained in the study area. Indeed, according to [70,71], ETa represented, on average, 60% of total terrestrial precipitation events, which was coherent with the modelled value of ETa that corresponds to 68% of precipitation events. P<sub>EFF</sub> was equivalent to 32% of total precipitation events, which agreed with the study realized by [50] who also worked on the Allier basin. The French geological survey, BRGM [72], indicated that weather stations with the lowest mean annual P<sub>EFF</sub> were located in continental lowlands, such as Clermont–Ferrand. ETa and P<sub>EFF</sub> decreased at a rate of -2.8 mm/y and -10 mm/y (-200 mm over 20 years), respectively.

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**Figure 9.** Water balance of the downstream part of the study area (as defined in Figure 1b) for the 2000–2020 period: inflows ( $Q_{IN} + P_{EFF}$ ) and outflows ( $Q_{OUT}$ ).  $\Delta S$  is the difference between inflows and outflows. All fluxes were expressed in Mm<sup>3</sup>/y.

The  $\Delta S$  fluctuations were strongly linked to the interannual variations of  $P_{EFF}$  ( $R^2 = 0.75$ ). During the period of 2011–2015,  $\Delta S$  was negative, meaning that the available water storage was more stressed than recharged. This was consistent with a significantly lower P<sub>EFF</sub> amount of 130 mm/y between the years 2011 and 2015. Cases of negative  $\Delta S$  values in water budget calculations were already reported in other studies [73,74]. In our case, if outflows were higher than inflows, it meant that there was a greater solicitation of the alluvial aquifer that supported the river. In the present case, water withdrawals (Q<sub>W</sub>) poorly influenced the water balance, except during the summers when irrigation occurred. At the annual scale, Q<sub>W</sub> represented 0.8% to 2.5% of the output fluxes (Figure 9), and it did not significantly improve the model calibration when inputted into Gardenia. Nonetheless, at the subannual scale, irrigation could represent up to 30% of the river flow monitored in Limons, such as that in July 2019 during an important drought. Then, the groundwater recharge was determined throughout the model, and it accounted for  $130 \pm 48$  mm/y between the years 2000 and 2020, making up 15% of overall precipitation events. This was very low compared to the recharge values observed in similar alluvial aquifers, which ranged from 10% to 34% [75–78].

Inflows in Figure 9 included  $Q_{NAUSS}$  (the part of the inflows monitored in Vieille-Brioude). Watersheds regulated by dams are numerous around the world [79–81], and their water releases can induce changes in river flow frequencies or in the interception of high flood peaks [82]. The year 2022 is an interesting example of the limitations of dam regulations: the Naussac Dam reservoir lake was indeed only 70% full, and the low-flow period started earlier, in May instead of June. This was due to the combined effects of insufficient winter precipitation events in the upstream part of the study area and the severe 2022 summer drought. If the dam is not sufficiently refilled in the winter of 2023, a period of crisis is expected for the following summer. The misfunctioning of the Naussac Dam would have important consequences on the summer  $Q_{VB}$ , on  $Q_{LIMONS}$ , and on groundwater levels such as  $H_{CULHAT}$  [82].

Hence, warming summers and the temporal unevenness of precipitation events have given rise to supplemental irrigation requirements at different places [83]. Achugbu et al. (2022) [84] stated that evapotranspiration is a major factor with respect to changes in streamflows due to the land use changes in their study area. Climate in the Allier River Watershed stood out as a major driver of the water balance, actual evapotranspiration, and effective precipitation, which were prevalent factors given the model outputs. The main challenge is being able to discriminate between climatic and anthropogenic influences. Climate would explain many of the observed trends in Northwest Europe, while, for Southwest Europe, human disturbances better explain both the temporal and spatial trends [85]. Effective future water resource management is threatened by the uncertainties

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related to the changing climate processes and anthropogenic impacts that are occurring on an increasing basis, as Lorenzo-Lacruz et al. (2022) [86] concluded in their study.

Different solutions have been proposed to mitigate the impacts of this so-called "global change". For instance, Mas-Pla et al. (2013) [87] proposed the alternative of using basement groundwater as a potential water supply to ease the pressure on overexploited stream-connected alluvial aquifers. This could be a solution, but only sporadically.

Gupta et al. (1985) [88] suggested using canals for irrigation, which could also allow the additional recharge of groundwater through canal seepage. The groundwater decline could also be reversed through an artificial groundwater recharge by using vertical shafts (with sand–gravel filters) [89] or infiltration galleries to move surface water into the aquifer [22] and to collect precipitation and ditch flow during the nonproduction season for later irrigation use. Reba et al. (2017) [90] investigated the use of on-farm reservoirs and managed an aquifer recharge (artificial recharge over nonconfined geological units). In Mississippi, a large number of reservoirs collecting winter precipitation were built to replace the use of alluvial aquifers, which suffer from a decline of more than 30 m in some places. Thus, the use of artificial reservoirs is a solution adopted in many watersheds, but it may not be the "best" solution in our case as there is already one (i.e., the Naussac Dam). As previously explained, it recently showed its limitations within the summer of 2022.

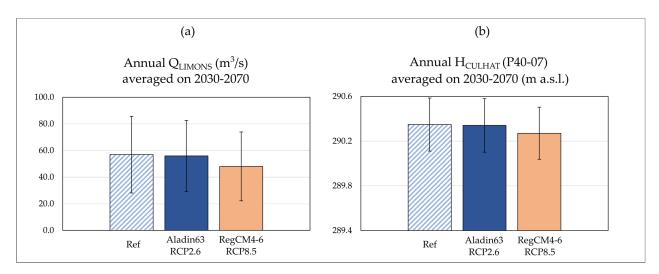
Possible solutions could be found in land use/cover management as well. For instance, Tribouillois et al. (2022) [91] studied the advantages of cover crops. They showed that using long-duration crops and diversifying rotations help in improving quantitative water management. The replacement of maize with crops requiring less water was also mentioned. Similar perspectives were explored by Martin et al. (2016) [92]: a full crop rotation would lead to a 10.5% reduction of irrigation withdrawals. In the case of our study, it would reduce human pressures when the Allier River is at its lowest rates. There are, therefore, interesting perspectives that have recently been proposed to achieve better water management through improved land handling.

#### 3.2.3. River Flow and Groundwater Level Variations from 2030 to 2070

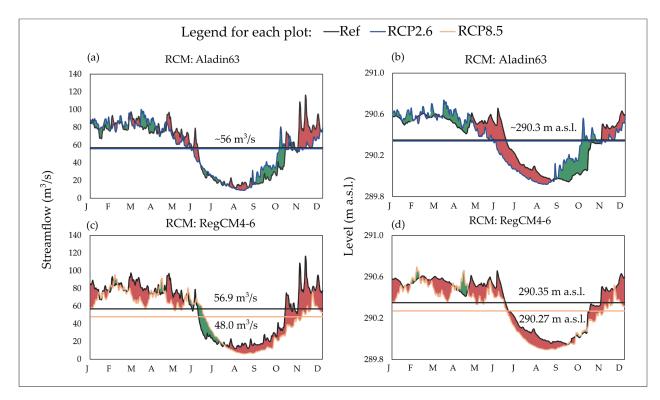
Figure 10 presents the reference (2000–2020) and the forecasted (2030–2070)  $Q_{LIMONS}$  and groundwater levels in Culhat-P40-07 ( $H_{CULHAT}$ ) according to the defined case scenarios in Section 2.4. The forecasted flows all decreased compared to the reference, up to  $48.05 \pm 25.90$  m³/s in RegCM4-6/RCP8.5 (Figure 10a). The reference of  $H_{CULHAT}$  was  $290.35 \pm 0.24$  m asl; the forecasted levels all decreased down to  $290.27 \pm 0.23$  m asl (in RegCM4-6/RCP8.5) compared to that reference (Figure 10b).  $Q_{LIMONS}$  was  $56.90 \pm 28.81$  m³/s over 2000-2020. Although, all the trends were downward, the differences between the scenarios were minimal at the interannual scale (Figure 10) as the standard deviations overlapped.

At the subannual scale, there were noticeable variations as well (Figure 11). The mean annual distribution of  $Q_{LIMONS}$  and  $H_{CULHAT}$  for the 2030–2070 period were computed according to different scenarios: the RCM Aladin63/RCP2.6 (Figure 11a,b) and the RegCM4-6/RCP8.5 (Figure 11c,d) scenarios. Each curve was compared to the reference determined with the 2000–2020  $Q_{LIMONS}$  and the 2007–2020  $H_{CULHAT}$ .

The ref  $Q_{LIMONS}$  and  $Q_{LIMONS}$  forecasts obtained through the Aladin63/RCP2.6 simulations (Figure 11a) presented a similar evolution except for a better distribution of the autumn flows that begin in early September and a flood control of the high flows occurring from October to December. RegCM4-6 in RCP8.5 (Figure 11c) showed a global decrease in the Allier flow rate with a flood control affecting the spring, autumn, and winter. The low-flow period was reduced compared to the reference and extended from late July to October. The flow rates were dramatically affected, reaching values lower than  $10~\text{m}^3/\text{s}$ . This was due to a decrease in precipitation and runoff and an increase in irrigation activities. The simulated decrease corresponded to -15.7% of the total streamflows.



**Figure 10.** (a)  $Q_{LIMONS}$  (m<sup>3</sup>/s) and (b)  $H_{CULHAT}$  for piezometer P40-07 m asl, both yearly averages for 2030–2070, were presented for the "best" case (RCM Aladin63 in RCP2.6) and "worst" case (RCM RegCM4-6 in RCP8.5). The error bars represent the standard deviations determined for 2030–2070 and "Ref" (reference), which stand for the observed  $Q_{LIMONS}$  for 2000–2020 and  $H_{CULHAT}$  (P40-07) for 2007–2020.



**Figure 11.** (a–c) Annual mean distribution of  $Q_{LIMONS}$  (m<sup>3</sup>/s) and (b–d) annual mean distribution of  $H_{CULHAT}$  for piezometer P40-07 (m asl) over 2030–2070 compared to the river flow reference (2000–2020) and the groundwater level reference (2007–2020). The green areas mean that the forecasted flow/level is above the reference and the reverse is represented by red areas. The yearly mean flow/level over 2030–2070 period for the reference and the forecast are also shown.

The forecasted  $H_{CULHAT}$  for 2030–2070 with Aladin63/RCP2.6 (Figure 11b) showed a shift in the low-water period that began in May and ended in September, whereas, with RegCM4-6 RCP8.5, a global decrease in  $H_{CULHAT}$  was observed (Figure 11d). The maximum annual decrease in the groundwater level was 0.08 m (worst case scenario). The Naussac Dam was included in the forecasts by setting 6 m³/s in Vieille-Brioude (see Section 2.2 for

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more details). It did not cause a difference in the river flows in the considered scenarios; it was indeed compensated by water withdrawals, especially irrigation.

Other studies have examined the impact of climate change on the hydrology of French rivers and aquifers, at basin scales, using similar hydrological models. Habets et al. (2013) [56] agreed with a global decrease in streamflows and groundwater levels in the Seine and the Somme River basins. The results were more contrasted for Thirel et al. (2019) [93] who forecasted a slight increase in the annual discharges of the Rhine River, which was even more important in RCP8.5, and a decrease in low flows by 2050. A more global study carried out at the French territory scale (Explore 2070 project, [94]) reported, in accordance with our results, a general decrease in river streamflows from 10% to 40%, with a stronger decrease in summer low flows. Moreover, the Explore 2070 specific groundwater report [95] mentioned a decrease in the groundwater recharge with climate change. The most pessimistic models indicated a very limited decrease in groundwater levels in the alluvial plains, which was consistent with the -0.08 m asl forecasted in the current study. Even though most hydrologic indicators point to an overall decrease in water resources, the consequences of climate change are quite heterogeneous in France and worldwide. Within several studies, the impact was mostly an acceleration of the existing seasonality with an increase in high flows during the wet seasons and a decrease in low flows during the dry seasons [96,97].

#### 4. Conclusions

This study presented a general assessment of the impacts of hydrometeorological (precipitation, air temperature, and river flow) and anthropogenic parameters (withdrawals and dam releases) on the Allier River and its alluvial aquifer over a recent period, from 2000 to 2020. The recurrence of intense droughts, the continuous exploitation of this hydrosystem, and the uncertain effect of climate change have all given rise to many concerns among local water managers and among the scientific community. In this framework, we proposed using hydrological modelling with Gardenia to determine the driving factors of the water balance at the Allier River Watershed scale. The model calibration carried out between 2000 and 2014 included hydrometeorological and water withdrawal data.

It appears that the Allier hydrosystem is not spared from climatic and anthropogenic influences and their classical evolution, showing a decrease in effective precipitation and groundwater recharge and an increase in anthropogenic pressures. At the subannual scale, the impact of the Naussac Dam was highlighted because its releases covered almost 100% of the river flow in Vieille-Brioude (the outflow of the upstream basin) and 50% of  $Q_{LIMONS}$  (the outlet of the whole study area) during summer droughts. Gardenia showed the participation of each component in the water budget. Actual evapotranspiration, effective precipitation, and groundwater recharge accounted, respectively, for 68%, 32%, and 15% of the total precipitation in the downstream part of the study area. The change in water storage  $\Delta S$  was tightly linked to the interannual variations of effective precipitation and was strongly affected by periods of drought (especially in 2011–2015, where  $\Delta S$  was negative).

In order to quantitatively forecast the evolution of both the surface and groundwater, two sets of climate projections from the DRIAS-2020 database (Aladin63/RCP2.6 and RegCM4-6/RCP8.5) were used. They, respectively, corresponded to the best and the worst scenarios of evolution considered in our study, Aladin63/RCP2.6 being the best and RegCM4-6/RCP8.5 being the worst. Whatever the scenario, the river flow at the outlet in Limons and the groundwater levels in Culhat decreased compared to the reference value determined in 2000–2020, with a more or less elevated amplitude depending on the scenario. Aladin63 /RCP2.6 led to a small decrease on an annual basis but also to a change in the distribution of high and low flows within the year. RegCM4-6 /RCP8.5 generated more important modifications with a large decrease in both river flows and groundwater levels.

The critical point of such a study is to distinguish the different drivers that affect water resource availability. Climate change and water withdrawals are the two major drivers that alter hydrological processes, but they are intimately related, as climate change generates

droughts that have higher water withdrawals for irrigation as a consequence. Irrigation indeed creates a real challenge: having to withdraw water from the streamflow when the river is the least able to supply it. That is why the Naussac Dam was built: to ensure a minimum flow in the Allier River. However, given the recent intense and longer-lasting summer droughts, managers are concerned about the difficulties of refilling the dam in the winter. Some alternatives were reviewed, and the use of artificial water reservoirs seems to be largely adopted. Nevertheless, considering the important uncertainties surrounding the Naussac Dam, a solution involving a reduction in withdrawals associated with improved agricultural land use management has to be favored.

Using hydrological modelling, this study showed that climate variability (in time and space) can be a major factor driving the alluvial hydrosystem water balance over anthropogenic pressures such as water withdrawals. The method presented in this paper could be applied to any watershed.

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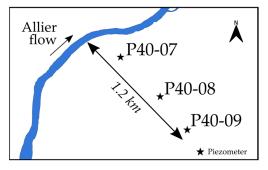
**Informed Consent Statement:** Not applicable.

Data Availability Statement: The data used in this article do not belong to us, most of the data are available on public websites and were downloaded on 1 November 2022. The river flow data are available at <a href="https://www.hydro.eaufrance.fr">https://www.hydro.eaufrance.fr</a>, the piezometric levels are available at <a href="https://bnpe.eaufrance.fr">https://bnpe.eaufrance.fr</a> and at <a href="https://bnpe.eaufrance.fr">www.eau-loire-bretagne.fr</a>, the meteorological data were issued from Météo-France (<a href="https://publitheque.meteo.fr">https://publitheque.meteo.fr</a>) but require a license, and the Naussac Dam release data are property of Etablissement Public Loire (EPL) and are not publicly available. Regional climate projections were downloaded from the DRIAS platform at <a href="https://www.drias-climat.fr/">https://www.drias-climat.fr/</a>. The hydrological model used in this article, Gardenia, can be openly accessed at <a href="https://www.brgm.fr/fr/logiciel/gardenia-logiciel-modelisation-hydrologique-globale-bassin-versant">https://www.brgm.fr/fr/logiciel/gardenia-logiciel-modelisation-hydrologique-globale-bassin-versant</a>.

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# Appendix A



**Figure A1.** Location of the three available piezometers on the Allier's alluvial aquifer in Culhat: P40-07, P40-08, and P40-09.

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Abbreviation	Significance		
CF	Clermont–Ferrand weather station (Figure 1b)		
SEDL	St-Etienne-de-Ludgares weather station (Figure 1b)		
VB	Vieille-Brioude (Figure 1b)		
P	Precipitation		
Ta	Air temperature		
PET	Potential Evapotranspiration		
ETa	Actual Evapotranspiration		
${ m P_{EFF}}$	Effective precipitation		
GWR	Groundwater recharge		
Q	River flow/discharge		
$Q_{W}$	Water withdrawal		
$Q_{LIMONS}$	River flow in Limons		
$Q_{VB}$	River flow in Vieille-Brioude		
$Q_{ALGN}$	River flow for the Alagnon River		
Q <sub>NAUSS</sub>	Water releases of the Naussac Dam		
NSE	Nash–Sutcliffe efficiency criterium		

Table A1. Table summarizing the most important abbreviations used throughout this study.

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