

Multi-decadal analysis of water resources and agricultural change in a Mediterranean semiarid irrigated piedmont under water scarcity and human interaction

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1	Multi-decadal analysis of water resources and agricultural change in a Mediterranean
2	semiarid irrigated piedmont under water scarcity and human interaction
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15	Abstract
16	Mediterranean piedmonts are an important hydro-agricultural systems. They constitute the junction
17	between the mountains, where the streamflow is generated, and the surrounding plains, where the water
18	is used. In Morocco, these traditional systems extend largely along the High Atlas Mountains. Yet,
19	changing conditions in the Mediterranean basin as well as recurrent droughts in recent decades remain
20	poorly understood in terms of hydrological and agricultural impacts, particularly in traditional hydro-
21	agro-systems. The combined effects of climate variability and ineffective management of water resource
22	dynamics may lead to increased water scarcity in these regions. The present work aims to assess the
23	effects of climate variability and associated agricultural changes on water resources in a traditional

25 points detection, was carried out on annual and monthly precipitation, and streamflow from 1965 to

irrigated piedmont of the Moroccan High Atlas. To that end, a trend analysis, together with change

26 2018. Then, the standardized precipitation index (SPI) was employed to identify meteorological

27 droughts. Also, groundwater, and spring discharge data were analyzed and discussed from 1973 to 2021. SPI outcomes revealed three major droughts, in 1981-1988, 1999-2008, and 2013-2018. Although the 28 29 precipitation data showed no significant trend, except for Tahannaout station, the average annual precipitation over the piedmont area decreased by 28%. Similarly, streamflow decreased significantly 30 by almost 40% for all stations, as did the Abainou spring's discharge. Consistent with that, groundwater 31 32 level has declined dramatically over the past decades in the downstream piedmont. These decreases in 33 water cycle components were tightly aligned with droughts. Yet, irrigation diversions were maintained 34 in both dry and wet periods. Paradoxically, this decrease in water resources was associated with an agricultural transition from seasonal crops (cereals) to perennial crops (olive trees). This conversion is 35 likely to amplify the water shortage, leading to groundwater resources overexploitation to satisfy the 36 37 growing agricultural demand.

Keywords: Mediterranean region, precipitation, streamflow, groundwater, agriculture, trends
analysis.

40 1 Introduction

The world's population has almost doubled from 1990 to the present, from 4.9 to 7.8 billion 41 people (U.S.Census Bureau, 2019). Representing roughly 6.8 % of the world's population, the 42 Mediterranean region was home to approximately 537 million inhabitants in 2015 with 43 projections to reach 670 million by 2050; of whom more than 250 million are distributed in 44 hydrological basins (World Bank, 2015; FAO 2015). Consequently, food and water demands 45 have increased in the Mediterranean region, putting higher pressure on water resources 46 (Godfray et al., 2010; Lopes, et al., 2020) and soils (Karamesouti et al., 2015), especially in the 47 48 east and southern parts, the most water-scarce areas (Daccache et al., 2014; Mekonnen and 49 Hoekstra 2016; United Nations 2017; Tabari, 2020). Moreover, the Mediterranean basin is identified as a hotspot of climate change (Giorgi, 2006; Diffenbaugh and Giorgi, 2012) with a 50 foreseen increase in temperature, decline in precipitation, and an intensification of the number 51

and intensity of extreme events in terms of floods and droughts, as well as a change in the
seasonal distribution of rainfall (Schilling et al., 2012; EEA, 2012; Tramblay et al., 2013).

Mountains around the Mediterranean are the water towers for the adjacent lowland basins 54 55 (Jarlan et al., 2015, 2016). these mountains supply water for irrigation and other water needs in piedmonts and downstream plains (Viviroli et al., 2007, 2011; Immerzeel et al, 2010). In a 56 57 recent study, Viviroli et al. (2020) showed that almost 1.5 billion people would depend on runoff contributions from mountain areas by the mid-twenty-first century. However, mountains 58 are also sensitive systems to climatic variability (Parry et al., 2007; Solomon et al., 2007; 59 Viviroli et al., 2011; Cuni-Sanchez et al., 2016; Immerzeel et al., 2020). In semiarid basins, the 60 plains are characterized by low precipitation, high evapotranspiration, and deep unsaturated 61 zones. However, the piedmont areas at the interface between mountains and plain benefit from 62 63 milder climatic conditions and water availability from upstream runoff that have made them suitable locations for the settlement of rural communities and their farming activities (Van 64 Steenbergen et al., 2011; Bresciani et al., 2018; Cody, 2018). Water availability in the piedmont 65 areas is closely related to the rainfall and snowmelt in the surrounding mountains that feed 66 streamflow and groundwater from winter to early summer. Those conditions have led to the 67 development of traditional irrigation in these piedmont areas. 68

Piedmont traditional irrigation systems use networks of gravity-fed surface irrigation earth 69 channels that divert floodwater from the river to supply irrigation from the piedmont to the 70 plain. The traditional irrigation system is mostly based on redistributing water from streams and 71 expanding the water flooded areas. In addition to satisfying the agricultural water requirements, 72 this practice promotes groundwater recharge (Bouimouass et al., 2020). Recent studies have 73 74 shown that it has a positive impact on groundwater quality through irrigation returns from highquality snowmelt-fed streamflow (Bouimouass et al., 2022, Rotiroti et al., 2019). Conversely, 75 modern irrigation uses water from dams, and a distribution network of concrete channels and 76

relies more on groundwater abstraction. This system uses also drippers that deliver water 77 78 directly to the plant's root zone, losing any additional groundwater recharge supplies, thus generally inducing negative effects on groundwater quantity and quality (Scanlon et al., 2007; 79 Bouimouass et al., 2022). The so-called "spate irrigation" is one of the oldest traditional 80 irrigation systems widely used all over the world. It is found especially in the Middle East, 81 North Africa, West Asia, East Africa, Europe, and parts of Latin America (Van Steenbergen et 82 al. 2011; Fernald et al., 2015; Leibundgut & Kohn, 2014). However, this irrigation system 83 underwent a considerable decline in the second half of the 20th century (Leibundgut & Kohn, 84 2014b). This system has been in practical use in very different and contrasted environmental 85 86 regions around the globe (Fernald et al., 2015; Leibundgut & Kohn, 2014; Mehari et al., 2007; 87 Tesfai, & Stroosnijder, 2001). For instance, in the semi-arid upper Rio Grande of the United States, Fernald et al. (2015) reported that community irrigation systems, known as Acequia, 88 89 which is derived from the word seguia in Arabic meaning an irrigation channel, have been governed by users to divert water from streams to irrigate northern New Mexico's agriculture 90 for centuries. In the northern side of High Atlas in Morocco, traditional irrigation uses not only 91 floods (like spate irrigation), but also the baseflow as long as the wadis might flow during 92 93 several months, especially thanks to snowmelt (Bouimouass et al., 2020). It is practiced through a secular network of irrigation channels locally named seguias. During the 20th century, the 94 main agricultural plains were converted to modern agriculture (Le Page et al., 2021), irrigated 95 by dams, concrete canals networks, and wells, thus making the traditional irrigation systems a 96 97 typical feature of the High Atlas piedmonts.

In a context characterized by droughts, water scarcity, and increasing water demand, particularly in the semi-arid Haouz-Tensift basin, it is necessary to know how those hydro-agrosystems are evolving in terms of agricultural activities and hydrological behavior. Towards the end of the century, average winter temperatures in the Moroccan High-Atlas are expected to

increase by 2 to 4°C simultaneously with a 25% to 60% reduction in precipitations (Tuel et al., 102 103 2020b; Hadri et al., 2020; Ayt Ougougdal et al., 2020; Driouech et al., 2020). Therefore, recent 104 studies based on hydrological models have pointed to a potential decrease in water resources for the southern Mediterranean region (Prudhomme et al., 2014; Marchane et al., 2016; Tuel et 105 al., 2020a). Snow constitutes a significant part of the precipitation over the High Atlas 106 Mountains (Hajhouji et al. 2018; Tuel et al., 2020a). Snowmelt contribute substantially to 107 108 streamflow during spring, ranging from 7 to 50% depending on the year (Boudhar et al., 2009), providing water for irrigation. Temperature rise may result in the degradation of the snowpack 109 and rapid snowmelt inducing changes in the wadis hydrological regimes (Lopez-Moreno et al., 110 111 2004, 2017; Tramblay et al., 2018), threatening irrigation period. Additionally, an overarching 112 program, the Green Morocco Plan (GMP), was launched by the government to develop the agricultural sector while preserving water resources by promoting a large expansion of drip 113 114 irrigation. However, the promised water savings allowed by this technology have been challenged by evidence from the field. Indeed, the benefits obtained by increased productivity 115 and farmers' incomes, and the shift to high-value crops have been accompanied by a greater 116 pressure on groundwater exacerbating its depletion (Venot et al., 2017). Therefore, assessing 117 118 the evolution of water resources and agriculture in a semi-arid context is a prerequisite for a 119 prospective analysis of their evolution which will help to guide public policies toward 120 sustainable management of water resources.

The present study aims firstly to assess the hydrological variability and water resource trends in the northern piedmont of the High-Atlas range from 1965 to 2020. Then the evolution of agricultural land use is analyzed from 1984 to 2020, with a focus on changes affecting the expansion of trees. The challenges that traditional irrigation systems in the piedmont face, as well as their sustainability issues are then discussed. Also, the study takes into account the spatial heterogeneity of the central High-Atlas piedmont, which is divided into three subareas 127 with distinct characteristics (Fig. 1): the Central Haouz, which has high surface water 128 availability as traversed by the basin's main wadis, the Mejjate, where groundwater is almost 129 the only available water resource, and the Chichaoua valley, which is irrigated by the region's 130 largest spring.

131 2 Study area

132 2.1 Water resources

The northern piedmont of the High Atlas, covering approximately 4400 km², is located in the 133 Tensift watershed, in central Morocco. It is a transitional area between the High-Atlas 134 Mountains (culminating at 4167 m.a.s.l.) and the Haouz plain ranging between 300 and 600 135 m.a.s.l. (Fig. 1). This piedmont is fed by intermittent and ephemeral wadis issued from the 136 mountains, but it is also crossed by larger wadis with mainly permanent streamflow, except 137 during some drought summers. From East to West these wadis are the Rdat, Zat, Ourika, 138 Rhiraya, N'Fis, Assif El Mal, and Seksaoua. During exceptional rainfall events, these wadis 139 may flow until the Tensift wadi at the north of the Haouz plain. The streams of the Eastern 140 piedmont have higher mean streamflow rates: Ourika 4.62 m³s⁻¹, Zat 3.33 m³s⁻¹, Rheraya 1.60 141 m³s⁻¹, and Rdat 2.34 m³s⁻¹. The peaking point of runoff occurs during the springtime, around 142 April, as a result of snowmelt (Boudhar et al., 2009; Marchane et al., 2017; Hajhouji et al., 143 2018). The average contribution of snowmelt to annual runoff represents around 19%, 36%, 144 41%, 22%, and 7% for N'Fis, Rheraya, Ourika, Zat, and Rdat basins respectively (Boudhar et 145 al., 2009). The wadis in the western piedmont have a pluvial runoff regime and lower average 146 147 flow: Seksaoua 0.65 m³s⁻¹. Groundwater is contained in a large Plio-Quaternary alluvial aquifer, which extends continuously over the piedmont and the Haouz plain. Groundwater flows from 148 the piedmont to the plain. It is withdrawn by wells and boreholes for drinking water of rural 149 population and irrigation in dry seasons. Spring discharge is uncommon in the area, and only a 150

151 few springs have measurable flow rates. The largest one is Abainou which irrigates the152 Chichaoua valley.

153 2.2 Agriculture and Irrigation

Traditional family agriculture is still the main activity in the piedmont area, consisting mainly 154 of olive trees and winter cereals (wheat and barley). Most of the olive orchards are associated 155 with an understory of annual crops, mainly cereals or forage, in order to optimize water use. 156 157 Local farmers use an extensive network of seguias, to divert water from the streams (Fig.2). Each irrigation system is managed by local Water Users Associations (WUAs) jointly with the 158 Office Regional de Mise en Valeur Agricole du Haouz (ORMVAH) which ensures the 159 distribution of streamflow between seguias with respect of the water rights where the principle 160 161 of upstream priority of water use is generally adopted (Kharrou et al., 2021). The same system is applied to Abainou spring, located in the valley of Chichaoua (Fig. 1). 162



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Figure 1: (a) The High Atlas piedmont (purple line) is located within the Tensift basin (black line) and is divided into three subareas: the central Haouz which is the most important traditional surface water-based irrigation area, the Mejjat area relying mainly on groundwater for irrigation and the Chichaoua Valley with irrigation based on the Abainou spring; (b) represents a sentienl-2 scene displaying the main features of the High Atlas piedmont.

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This ancestral community-based irrigation system was built to share the water of snowmelt-
fed streams coming from the High-Atlas between farmers to support their local livelihoods.
Each major seguia ramifies into several secondary seguias, which in turn ramifies into tertiary
seguias (Fig. 2). The major seguia is governed by a WUA and each secondary seguia has a
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delegate chosen in agreement by all the seguia members who are responsible for the water
distribution between beneficiaries according to the historical and recognized water rights. A
major seguia irrigates lands up to thousands of hectares and hundreds of users.



Figure 2: Photos of seguias from the study area, representing Seguias network in the piedmont; A: tertiary seguia irrigating
fields, B: secondary seguia uptake, and C: the major Seguia diverting water directly from the Ourika stream.

178 **3 Material and methods**

179 3.1 Hydro-meteorological data and analysis

For this study, we used several hydro-meteorological datasets concerning rainfall, streamflow, irrigation water, groundwater level, and spring discharge (Fig. 1 S). Rainfall is measured by ORMVAH and the basin agency (ABHT, Agence du Bassin Hydraulique du Tensift), with records available since 1969. A large network of rain gauges was used to elaborate a spatiotemporal distribution map of the entire Tensift basin. Five gauges were selected within the piedmont area (Table 1, Fig. 1 S) to analyze rainfall trends and evaluate droughts.

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Table 1: The piedmont rainfall stations network used in the study.

C 1	Lambert co	oordinates		Recording periods	
Stations	X (Km)	Y (Km)	Elevation (m)		
Sidi Rahal	303.1	117.8	690	1967-2018	
Ait Ourir	291.25	107.5	760	1969-2018	
Ourika	276.15	83.05	1070	1969-2018	
Tahannaout	255.9	80.4	925	1969-2018	
Chichaoua	181.53	111.2	340	1965-2018	

188

The daily streamflow dataset at the gauging stations of the main wadis from the High Atlas from 1965 to 2018 were provided by the ABHT. The diversion of streamflow for irrigation was monitored at the upstream uptake of the seguias jointly by the WUAs and ORMVAH and the distribution of water among seguias is made according to the recognized water rights. We also calculated the seguias diversion ratio using water diversion records from 2000 to 2020 provided by ORMVAH.

The variation of the groundwater level over the Tensift basin is monitored by the ABHT. In this study, four piezometers named 766/53, 2701/53, 1133/53, and 744/53 (Fig. 1, and 1 S) were selected to show the groundwater variation from 1984 to 2021 upstream and downstream of the piedmont area. Finally, the Abainou spring discharge was measured by the ABHT at a monthly timestep from 1973 to 2020.

200 3.2 Landsat imagery

To characterize the agricultural land use evolution, a time series of classifications based on multispectral Landsat imagery was achieved. Crop classification was performed using a decision tree (DT) approach based on expert rules. DT can be trained rapidly and executed quickly (Gahegan & West, 1998). It performs well for land use mapping (Yang et al., 2003; Waheed et al., 2006; Otukei, & Blaschke, 2010; Jiang et al., 2011; Sharma et al., 2013), especially when phenological data or vegetation index threshold values are incorporated
(Wardlow et al., 2007; Simonneaux et al., 2008b; Masialeti et al., 2010; Ozdogan, 2010). To
that end, all available cloud-free Landsat images corrected in surface reflectance from 1984 to
209 2020 were downloaded from the USGS (the United States Geological Survey) website,
including Landsat 5 (TM), Landsat 7 (ETM+), and Landsat 8 (OLI).

211 3.3 Methods

212 *3.3.1* Statistical analysis of hydro-meteorological time series

The non-parametric statistical test of Mann-Kendall (MK) (Mann 1945, Kendall 1975) and 213 Sen's slope estimator (Sen, 1968) was performed on precipitation and streamflow time series 214 to assess the presence or absence of a clear trend in the long-term evolution of water resources 215 within the High Atlas piedmont. In addition, the Pettitt (1979) test was used to determine the 216 217 trend change points and check the homogeneity of the data. Also, the meteorological droughts over the piedmont were assessed by the Standardized Precipitation Index (SPI). SPI was 218 developed by McKee et al. (1993) and Edwards and McKee (1997) and recommended by the 219 220 World Meteorological Organization (Hayes et al., 2011; WMO, 2012).

221 3.3.2 Mapping agricultural land use

In traditional systems such as the High-Atlas piedmont, the use of Landsat imagery for monitoring agricultural activities is quite challenging because of the predominance of small agricultural fields of less than one hectare, as compared with the 30-meter resolution of Landsat. However, the simplicity of the land cover, consisting of three classes, and the fact that they are often aggregated in homogeneous patches, limits the problem of confusion. Another problem is that historical Landsat data was not always acquired every 16 days and the occurrence of cloud cover, especially during the crop development phases of winter crops, reduces the

availability of usable images. An additional key limitation was the lack of ground data to be 229 230 able to train the classifier for past years. Thus, in order to be able to build a land cover time series for the period 1984-2020, we built a simple decision tree algorithm based on the temporal 231 signature of the crops using a limited number of key periods for which the land cover classes 232 have contrasted behaviors. Indeed, there are usually not enough clear Landsat images to be able 233 to build a temporal profile of vegetation development that would be required to apply a decision 234 235 tree approach as proposed by (Simonneaux and Francois, 2003; Simonneaux et al., 2008b). Instead, for most of the years, we were able to find images distributed over the agricultural 236 season (February, April, June, and August). 237

The olive tree is an evergreen species and exhibits vegetation all along the year, which means an NDVI value (Normalize Difference Vegetation Index) is always higher than the ones of bare soils. Cereal crops are characterized by the first period of bare soil around December/ early January, then a peak of vegetation around March, and another phase of bare soil after harvest. Based on these simple rules, a decision tree classifier has been built based on images selected at four periods (B1= February, B2 = April, B3 = July, and B4 = September) (Fig. 3).



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Figure 3: The decision tree classification based on NDVI over four key periods.

In order to validate the classification results, ground truth data were collected during a field mission conducted on December 4, 2020. A total of 76 parcels were observed, 26 plots of olive trees, 28 plots where cereals were grown in winter 2020, and 22 of fallow bare soil showing that no crop was present for at least one year. In addition to the field trip, trees and bare soil plots (parcels) were selected on Google Earth for the years 2005, 2010, and 2015 to check the presence or absence of trees.

252 4 Results



253 4.1 Rainfall trends and meteorological droughts

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Figure 4: (a) Monthly average rainfall evolution over the High-Atlas piedmont from 1969 to 2018, where mu1 is the mean
annual rainfall (mm) before the change point and mu2 as the mean annual rainfall (mm) after the change point. (b) The Tensift
basin with precipitation stations showing the spatio-temporal distribution of average annual precipitation (1969 to 2018).

In figure (4, b), there are three altitude bands, the lowland to the north with altitudes between
300-600m where the rainfall varies between 150-300mm/year, the piedmont area with altitudes

from 700 to 1100m where rainfall varies between 300-450mm/year, and finally the mountains 260 261 with altitudes above 1500m and rainfall above 500mm/year. Also, the eastern stations receive more precipitation than the western ones, which can be explained by the higher altitudes in the 262 eastern part of the Tensift (higher than 4000m) which allows it to benefit from additional 263 precipitation in the form of snowfall. For a global view of the piedmont area, we computed the 264 average rainfall series of the five stations. According to Pettitt's test, the rainfall time series 265 presented a clear change point and the rainfall patterns could be divided into two periods: 1969-266 1979 with an average rainfall of 430 mm/yr, and 1980-2018 with an average rainfall of 310 267 mm/yr (Fig.4, a). This breakpoint in rainfall series has already been observed in other sites in 268 269 Morocco, occurring at various dates depending on the location, usually between 1970 and 1980 (Driouech, 2006; Agoumi et Debbarh 2006; Benassi, 2008; Singla et al., 2010). 270

Looking at each station individually, Tahannaout, Ait Ourir, and Sidi Rahal revealed a negative trend, but this trend is much weaker for Chichaoua, and Ourika (Fig.5, b). In order to evaluate if this change was the result of a steady decrease or the result of a break, Pettitt's test was used on the rainfall data (Tab.2). Among these rainfall stations, only Tahannaout showed a significant change point in 1977 (Fig.5, b).

The SPI analysis revealed that the High-Atlas piedmont witnessed several droughts over the period 1969-2018 (Fig. 5, a). Despite some differences, the four stations showed generally a similar behavior, with three main droughts periods identified in 1981-1988, 1999-2008, and 2013-2018. The second drought, 1999-2008, was particularly severe with an SPI index above -2.5.



Figure 4: (a) SPI 12-month calculated based on rainfall monthly data. Droughts periods are highlighted in yellow, and wet

284 periods in blue. Red arrows highlight major droughts. (b) The linear trend of annual average rainfall at the studied stations.

285 4.2 Streamflow trends and variability

The analysis of streamflow time series over 1965-2018 showed a general declining trend for all the wadis. The MK trend test revealed a decreasing trend for all streamflow stations over the period 1963 to 2018, with p-values less than 0.05 (Tab. 2). It is also worth pointing out that the streamflow showed a clear sensitivity to the three drought periods with alternations between low and high streamflow during dry and wet periods respectively. Pettitt's test results for streamflow at the Zat and Rheraya, Rdat, Ourika, and Chichaoua stations revealed transition points in 1973, 1980, 1997, and 1998 respectively (Fig. 6).

293 Table 2: Monotonic trend (MK) test and significant change (Pettitt's homogeneity) test for the streamflow and rainfall
294 stations in the High-Atlas piedmont for the period 1969–2018. MK: Mann-Kendall.

Streamflow							
Station	MK test				Pettitt's test		
Station	Kendall's tau	S	p value	Trend	К	p value	Homogeneity
Ourika	-0.076	-12586	0.0064	Y	12943	0.019	Р
Rheraya	-0.101	-20773	0.0001	Y	21378	0.0002	Р
Zat	-0.129	-27513	< 0.0001	Y	17737	0.004	Р
Rdat	-0.058	-12094	0.0273	Y	25664	< 0.0001	Р
Chichaoua	-0.058	-8437	0.0472	Y	12443	0.0156	Р
Rainfall							
Station	MK test			Pettitt's test			
Station	Kendall's tau	S	p value	Trend	K	p value	Homogeneity
Ourika	-0.161	-197	0.101	Ν	167	0.8358	R
Tahannaout	-0.229	-281	0.019	Y	312	0.0208	Р
Ait ourir	-0.174	-214	0.074	Ν	236	0.1962	R
Sidi rahal	-0.209	-257	0.032	Y	266	0.0826	R
Chichaoua	-0.088	-91	0.396	Ν	130	0.8628	R

Legend = Y: Significant trend; N: No trend; P: Data are not homogeneous; R: Data are homogeneous.



- 298 Figure 6: Homogeneity test of the monthly streamflow for Ourika, Zat, Rheraya, Rdat, and Chichaoua streams from 1965 to
- 299 2018, where mu1 and mu2 are the monthly mean streamflow (m3/s) before and after the change point respectively. The y
- 300 ellow shades indicate the three main drought periods observed in the region.

301 4.3 Irrigation diversion

Agricultural activities based on irrigation water diverted from streamflow are a defining feature of the High Atlas piedmont. The highest diverted volume are linked to the wadis with high discharge, Ourika, and Rheraya. The diversion ratios were always maintained high, up to 80 % during both wet and dry periods, showing the very high exploitation of these natural resources by the population in this area. Given that irrigation diversions depend on streamflow rates which declined by nearly 40% during droughts, it follows that the volume diverted have also decreased substantially (Fig.7, a).





Figure 7: (a) Seguias monthly time-series diversions recorded by the ORMVAH over the period of 2000 to 2020 in Ourika and
Rheraya streams. (b) Monthly water volumes diverted by seguias in Ourika and Rheraya between 2000 and 2020. (c) Abainou

- spring discharge evolution from 1972 to 2020, with change point marked in yellow (May 2001). where mu1 and mu2 are the
- 313 monthly mean spring discharge (m3/s) before and after the change point respectively.

The streamflow is diverted all along the year by seguias. Two periods of high-water volume diversion have been identified in Ourika. A first peak is observed in November corresponding to rainfall, followed by a decrease due to the occurrence of snow. Then a second peak is observed between March and May, which corresponds to the snowmelt period (Hajhouji et al., 2018). For Rheraya, the autumn peak is not visible and the snowmelt peak only last in March, this may be due to the fact that more water uptake is conducted upstream. These variations reflect the pluvio-nival behavior of these basins (Fig.7, b).

321 4.4 Groundwater level variation

Changes in groundwater level were analyzed using historical datasets of four piezometers (see 322 location in Figure 1, a) since 1984. In the upstream part of the Central Haouz, the long-term 323 variation of groundwater level is low in the piezometers Ourika (766/53), Ghmat (2701/53) 324 (Fig. 8, graphs C and D); in this area, the groundwater is well recharged seasonally by 325 326 streamflow and surface water irrigation returns, due to the proximity of the mountain and the 327 rivers, over winter and spring. However, downstream of the piedmont of the Central Haouz in Chouiter (744/53) and in Mejjate (1133/53) where agricultural activities are based mainly on 328 groundwater, the groundwater level showed a rapid decrease since the 2000s (Fig.8, graphs A 329 330 and B), which can be explained by droughts, high withdrawals, and lower recharge due to the geographical location away from the wadis, which constitute the source of water (Fig. 1, and 1 331 S). In Chouiter (744/53, B), the decrease rate is around 2m.y-1 since 2000, while in Mejjate 332 (1133/53, A) the pace was around 1.5 m.y-1 between 2002 and 2016 and is close to 5m.y-1 333 since 2016. 334



Figure8: Groundwater level variation from 1984 to 2021 in the upstream Ourika (766/53) and Ghmat (2701/53 C, D) and
 downstream piedmont Mejjat(1133/53) and Chouiter (744/53 A, B).

338 4.5 The Abainou spring

The spring of Abainou supplies irrigation in the valley of Chichaoua (Fig.7, c) that encompasses one of the oldest traditional irrigation systems in the basin. In the 1970s, the spring discharge was about $0.55 \text{ m}^3 \text{ s}^{-1}$. A severe decline has been seen since 2000, however, the latest starting in 2013 is more drastic. The average spring outflow has been reduced by over 70%, from 0.55 m³ s⁻¹ in 1972 down to less than 0.2 m³ s⁻¹ in 2020. These spring discharge breakpoints are correlated with the major droughts identified in the region between 1999-2008, and 2013-2017.

346 4.6 Land-use mapping and change analysis

The piedmont of the High Atlas is generally known for subsistence agriculture (family 347 farming), with cereals and olive trees as the main crops. Therefore, three landcover classes were 348 targeted: annual crops, trees, and bare soil. The decision tree classification, based on NDVI 349 thresholding, was applied to map those classes from 1984 to 2020. The limitations of the 350 decision tree approach in our case were extremely wet years when weeds grow throughout the 351 year leading to a possible land use overestimation, especially trees. To help the algorithm 352 353 eliminate overestimation errors due to weeds, we tried to introduce more summer images in wet years (1989, 1996, 1997, 2009). Thus, introducing additional summer images, when the weed 354 cannot be irrigated and begins to disappear, increases the probability to detect bare soil and 355 identify the right class. In addition, some other years (i.e., 1987, 1991, 1995, 2008, 2011, 2012) 356 were not considered in the historical analysis due to the non-availability of Landsat images or 357 358 the images presented a significant cloud cover.

359

Table 3: The confusion matrix.

Ground truth data						
Ľ		Trees	Annuals	Bare Soil		
catio	Trees	26	0	0		
Classific	Annuals	0	23	5		
	Bare Soil	0	3	19		

360

To assess the effectiveness of the applied algorithm, the overall accuracy (OA) method was used. This involves calculating the number of classified sites and then dividing by the number of reference sites. Using this method, an overall accuracy of 89.4% is obtained for the High Atlas piedmont land use map based on the field samples for validation (Table 3). Regarding Google Earth plots for the years 2005, 2010, and 2015, the algorithm was able to identify these classes with 100% accuracy, since tree and bare soil profiles cannot be confused.

The seasonal crops consist mainly of cereal crops, which constitute the most important 367 368 nutritional crops for piedmont families. The inter-annual variability of areas cultivated with cereals is strongly correlated with the annual precipitation patterns. This confirms that these 369 crops are mainly based on rainfall for irrigation. In wet years, when surface water is available 370 and rainfall events are well distributed, cereals water needs are well satisfied thus enabling high 371 production. In dry years, the cereal crops are either not or poorly cultivated as a result of water 372 shortage (Fig. 2 S); local farmers in the country traditionally wait for the first rain event in late 373 September or early October before sowing. 374

The trees, dominated by olive orchards, occupied 5604 Ha in 1985 which represents barely 375 376 1.3 % of the piedmont area (Fig.9, and 2S). The main tree areas were located in the Eastern part of the piedmont (Central Haouz) where the trees were planted near the main streams Ourika, 377 Zat, and Rheraya. They benefit from the most extensive traditional irrigation channel network 378 379 of the High Atlas piedmont, and perennial irrigation from sustained snowmelt runoff. Paradoxically, along the largest stream of the area the Nfis wadi, the trees have not been 380 developed as much. This could be explained by the presence of the Lalla Takerkoust dam which 381 supplies water for irrigation since 1935 to N'Fis sectors downstream in the Haouz plain. Due 382 383 to limited surface water, there were hardly any arboricultural farms in the western part of the 384 piedmont, Mejjat, but rather a large area devoted to seasonal rain-fed crops. The Chichaoua valley was an exception since trees farming was developed essentially due to perennial 385 irrigation by the Abainou spring. 386



Figure9: (a) Trees cover for the period from 1985 to 2020 (b) within the High Atlas piedmont, and (c) trees evolution from 1984
to 2020, with droughts outlined orange, and the main government programs over the period..

Over the last 36 years, tree crops expansion across the High-Atlas piedmont showed two distinct periods: 1984-2010 and 2011-2020. From 1984 to 2010, the expansion of trees over the area was generally slow and steady. Then, a rapid expansion occurred reaching its maximum pace during 2017-2020 (Fig. 9, c).

By 2020 the piedmont tree-covered areas (Fig. 9, b, c) reached 35332 Ha, about 8% of the cultivated areas, representing nearly seven times the initial surface (1984). The trees extended considerably both over the eastern piedmont irrigated by streamflow and groundwater, and over the western piedmont relying mainly on groundwater for irrigation.

398 **5 Discussion**

399 5.1 Temporal and spatial changes in water resources

400 Even though the piedmont areas benefited from water availability favorably than the plain, all the analyzed hydrological variables have shown a decreasing trend over the past 50 years. 401 Therefore, the major hydrological changes were revealed since the 1980s. The precipitation has 402 declined by 28% (Fig.4a, 5b). Recently Ouatiki et al. (2019) pointed out the same general 403 decreasing tendency in rainfall over a neighboring basin, the Oum Er-Rbia basin. In addition, a 404 decreasing trend in precipitation for most Mediterranean countries was revealed by Philandras 405 406 et al. (2011) through a detailed analysis of data from 40 meteorological stations between 1900 407 and 2009. Also, three main meteorological droughts were delineated: 1981-1988, 1999-2008, and 2013-2018 (Fig.5a). The longer and more severe one is between 1999 and 2008, which has 408 also been reported in various countries of the Mediterranean basin (Cook et al., 2016; Hanel et 409 410 al., 2018). Additionally, streamflow has declined by almost 40% (Fig.6). These findings are 411 consistent with the recent study by Masseroni et al. (2020) who analyzed runoff data between 1965 and 2015 from more than 3,000 stations over the Mediterranean region. They found that 412 the declining trend of annual streamflow started in 1965, and by 1980 the volumes were 413 systematically below the average. The overall decrease in runoff resulted in a decrease in 414 diverted volume of streamflow to irrigation. Despite that, the diversion ratios are high in both 415 dry and wet periods, ranging from 70 % up to 80 %. They highlighted the great importance of 416 streamflow-based irrigation to local farmers in a semi-arid context and their strong adaptation 417 418 capacity to natural variations, as the area covered by cereals is strongly related to rainfall and runoff. 419

420 Concerning the groundwater, except for the upstream areas benefiting from consistent 421 recharge by irrigation returns (Bouimouass et al., 2020), a severe decrease is observed in

piezometric levels elsewhere since the early 2000s. The observed depletion of the piezometric 422 423 level occurs over the downstream area at a rate of 2m.y-1 in Chouiter, while in Mejjate it was around 1.5 m.y-1 between 2002 and 2016 and is close to 5m.y-1 since 2016. These are in line 424 with other studies highlighted rates, around 1-3 m/year on average (Fakir et al., 2015). The 425 decline of groundwater level is attributed to recurrent drought periods and intensive 426 groundwater pumping (Boukhari et al. 2015). Pump wells were introduced in the last century 427 firstly in the Haouz plain by the French colonization. Those wells have spread in the area and 428 currently, almost every farm has at least one well dedicated to irrigation during the dry season 429 and in some cases used for drinking and domestic needs. Unfortunately, there are no records of 430 431 the volumes being pumped or accurate statistics on the number of boreholes since most are dug illegally in the region. Additionally, the Abainou spring, which provides water to irrigate 432 agriculture in Chichaoua valley, has also been declining since the 1980s, jeopardizing its socio-433 economic importance and increasing the risks of its drying up (Fig. 7, c). 434

435 5.2 Agricultural land use dynamic

The evolution of annual crops (mainly cereals) extent was highly correlated to rainfall. The decreasing trend in rainfall and droughts resulted in a lower extent and production of rainfed cereals, which is considered critical for food security in Morocco (Schilling et al., 2012, Karrou et al., 2012) and rural population incomes. This is a common issue in the semi-arid regions of the southern Mediterranean, where about 80% of agricultural land is rainfed, therefore highly vulnerable to droughts (Schilling et al., 2020).

The past distribution of trees in the studied High Atlas piedmont showed a clear spatial variation. In the eastern piedmont of Central Haouz, the olive trees extended mainly along the main wadis; the water availability has encouraged the settlement of rural communities that logically led to the development of irrigated agriculture (Awulachew et al., 2007). The western

piedmont of Mejjate was known for rainfed seasonal agriculture. Over the last 36 years, the 446 447 interannual evolution of tree crops across the High-Atlas piedmont showed two highly disparate trends. During a long period 1984-2013 (29 years), the expansion of trees remained near stable 448 over the area, with 2 slight variations: an increase in 1995-1999 and a slight decrease in 2000-449 2007, which coincided respectively with a wet period and a dry period. Therefore, the 450 development of trees during this long period seems to be controlled by climatic drivers. 451 However, during the last 7 years, 2013-2020, the expansion of trees was spectacular (Fig.9). 452 Paradoxically, this rapid expansion is occurring in the context of severe droughts and could not 453 be explained by climate variability. In fact, in recent years several governmental support 454 455 programs were launched aiming at the development and modernization of the agricultural sector (Faysse, 2015; Agricultural Development Agency. 2012, 2014). Particularly, the Green 456 Morocco Plan (GMP) launched in 2008 aimed to make agriculture a pillar of the socio-457 458 economic development in Morocco through the development of modern agriculture with high added value both in the irrigated and favorable rainfed areas; and the enhancement of 459 agricultural income in the most vulnerable areas (ADA, 2018). The GMP helped increase the 460 production of high-value perennial crops, such as citrus and olive trees, mostly by expanding 461 cultivated areas thanks to the subsidies awarded (Akesbi, 2013). In addition, the National 462 463 Irrigation Water-Saving Program (PNEEI), which is a major component of the GMP, was implemented to ensure the rational and efficient use of irrigation water resources by promoting 464 the development of drip irrigation technology (Faysse, 2015; Faysse, and Simon, 2014 Akesbi, 465 466 2013). However, these measures have conversely favored the expansion of irrigated agriculture to traditionally rainfed or uncropped areas (Jaramillo et al., 2020; Molle, 2017), relying on 467 groundwater withdrawals, which has subsequently led to increased water demand and 468 groundwater overexploitation (Fig. 3 S). 469

470 5.3 Sustainability of piedmonts' traditional hydro-agro-systems

The piedmont of the High-Atlas Mountains has been sheltered for centuries and still adopt 471 over a large area a traditional irrigation system. The latter use large networks of gravity-fed 472 surface irrigation channels that divert the streamflow (baseflow and floods) at the outlet of the 473 Mountain ranges (Bouimouass et al., 2020). A key factor of survival for such an ancestral 474 system is the sense of mutualism between the seguias users, which is defined by Gunda et al 475 (2018) as the feeling of collective well-being including social identity, pride of place, and 476 477 maintenance of historical traditions. This mutualism has not excluded conflicts that have been raised during periods of severe droughts. These hydro-agro-systems are also characterized by 478 great flexibility to water resources fluctuations. 479

During the last years, the planting of trees has been performed at a rapid pace, mainly driven 480 by socio-economic incentives under conditions of droughts and water scarcity. The trees 481 expansion is creating an increasing and rigid water demand that should be satisfied whatever 482 the conditions of climate and water resources. Thus, the observed decrease in precipitation and 483 484 streamflow would change the traditional irrigation in the piedmont from a surface water-based irrigation to a groundwater-based one. This is already the case in the Mejjate area (western 485 piedmont) where the observed expansion of trees is associated with a decrease in groundwater 486 level. The same situation is spotted in the downstream limit of the central Haouz piedmont 487 receiving less irrigation water, only during flood events. Also, the irrigation in the Chichaoua 488 valley by the Abainou spring, whose discharge has been continuously reducing, is undergoing 489 490 the same evolution. The consequences of the shifting from surface water-driven irrigation to groundwater-based irrigation are a severe depletion of groundwater, especially in the 491 downstream areas. Beyond the question of the durability of this type of agriculture, it raises the 492 question of the impact on the aquifer recharge downstream. In fact, in the Haouz plain, a 493 dramatic groundwater depletion of 1 to 3 m year⁻¹ in average is observed since the 1990s 494

(Boukhari et al., 2015; Fakir et al., 2015). Although the depletion of the piezometric level
observed in these areas is due to extensive pumping by the plain agriculture itself, it may be
exacerbated by the less recharge from the piedmont that is subject to increasing groundwater
abstraction.

Indeed, this agricultural intensification is not only occurring in Morocco but also on a broader 499 scale. Worldwide, the equipped areas for irrigated agriculture increased from 289 to 342 million 500 501 hectares between 2000 and 2020, with nearly 38% being supplied by groundwater-based irrigation (Crumpler et al., 2021; Siebert et al., 2010). Furthermore, by employing the PCR-502 GLOBWB hydrological model for gross crop requirements for irrigation and the available water 503 504 to meet that demand, Wada et al. (2012) revealed that the use of non-renewable groundwater withdrawals for irrigation is highest in India, followed by Pakistan, the United States, Iran, 505 China, Mexico, and Saudi Arabia. Their findings also suggested that globally this contribution 506 has been tripled over the period 1960-2000. Now, there is no doubt that India, a country with a 507 508 similar context as Morocco, has the largest extent of irrigated areas. Despite a low increase of 509 irrigated area from 58.8 % to 60.4 % between 1961 to 2016 (World Bank, 2017; Siebert et al., 510 2010), an intensification occurred, triggered by government irrigation facilities, cheap electricity for pumping, and a diversified crop basket since the 1970s (Dangar et al., 2021; Paria 511 512 et al., 2021). The cropping intensity was also driven by the use of chemical fertilizers, and a rapid rise in the number of electric and diesel pumps to reach higher yields (Paria et al., 2021; 513 Mishra et al., 2018; Shah, 2010). In such a context, the direct reliance on groundwater 514 abstraction to meet the growing irrigation water demand exacerbates groundwater resource 515 depletion, even in areas with abundant rainfall (Dangar et al., 2021; Zaveri et al., 2016; Rodell 516 517 et al., 2009; Gandhi and Namboodiri, 2009).

This issue has also been highlighted in the northern side of the Mediterranean basin (FAO
2016). In Spain, for instance, agricultural policies have supported irrigated farming to increase

food production and save water. Over the last three decades, the promotion of drip irrigation 520 521 over surface irrigation had several consequences. Wells construction has intensified, redistributing access to groundwater and causing a significant lowering of the water table. In 522 addition, the expansion of irrigation in the piedmont and Mountain areas, previously rain-fed, 523 resulted in an increase in water consumption from 4% to 45% per hectare. There was also a 524 shift to higher-value fruit crops with higher water requirements (González-Cebollada, 2015). 525 526 and finally, the removal of traditional surface irrigation infrastructure dating back to the Middle Ages (Sese-Minguez et al., 2017). 527

The socioeconomic and the hydrological functions of the traditional irrigation piedmont as a 528 secular hydro-agro-system that was sustained for tens of centuries through a sound connection 529 between natural and human elements to ensure food security, water balance, groundwater 530 recharge, and droughts survival, are being altered. Their sustainability is currently of great 531 concern and their degradation would be accelerated by climate change, particularly through 532 decreased precipitation (Polade et al., 2017; Barcikowska et al., 2018), increased 533 534 evapotranspiration (Le Page et al., 2021), and reduced groundwater recharge (Crosbie et al., 535 2013; Wu et al., 2020). Given that the traditional irrigation in the piedmont of the High-Atlas Mountains in Haouz region has been identified as the main source of groundwater recharge 536 537 (Bouimouass et al., 2020), the preservation of this vulnerable hydro-agro-system should be considered in the agricultural and socio-economic development policies. Particularly by 538 limiting the expansion of the irrigated agriculture over the Haouz plain which threatens the 539 groundwater resources sustainability. Additionally, the government agricultural support should 540 be revised in a such vulnerable hydro-agro-systems to mitigate the current changes and the 541 542 future climate change impacts.

543 6 Conclusion

The traditional irrigation system in the High-Atlas piedmont is similar to several other 544 545 systems around the world. They have played through centuries vital roles in socio-economic development while maintaining a balance between water resources and water needs. The 546 present study of the High-Atlas piedmont has shown that the overall state of water resources is 547 declining and deeply affected by droughts during the last 5 decades. Average precipitation has 548 decreased by almost 28 % and the streamflow has decreased by more than 40% directly 549 influencing the amount of water diverted by seguias for irrigation. The groundwater is depleting 550 551 as attested by water table decline and by the Abainou spring's dramatic drying. Conversely, in recent years, there has been a spectacular expansion of tree crops despite water scarcity. Also, 552 553 it was shown that the agricultural land use is changing from seasonal crops (cereals) to perennial crops (trees), which creates an increasing and rigid water demand to satisfy, whatever the 554 conditions of climate and water resources. 555

This challenge is also found in the northern parts of the Mediterranean basin as well as in 556 northwestern India. Government subsidies intended to support irrigated agriculture in order to 557 increase food production have led to a direct dependence on groundwater abstraction to meet 558 the growing demand for irrigation water, thereby exacerbating groundwater resource depletion. 559 The uncontrolled expansion of trees, or generally irrigated areas, which is mainly driven by 560 strict socioeconomic incentives induced by several governmental agricultural supporting 561 programs, the multiplication of pumping, and the climate variability, threaten seriously the 562 sustainability of such ancestral traditional hydro-agro-systems. The climate variability observed 563 564 over the last 50 years has already had major impacts on water resources in the Mediterranean region, particularly in snow-related basins. The land-use changes are evolving in a direction 565 566 that is incompatible with balanced hydro-agro-systems. Therefore, interdisciplinary research

- and management strategies are needed to assess the occurring changes and to provide adaptationand mitigation measures to preserve their long-term sustainability.
- 569

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