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### Nutrient inputs and hydrology together determine biogeochemical status of the Loire River (France): Current situation and possible future scenarios



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#### HIGHLIGHTS

#### GRAPHICAL ABSTRACT

- Riverstrahler model was implemented on the Loire River for running scenarios.
- River eutrophication was reduced with better wastewater treatment.
- Alternative agro-food system systems would allow decreasing nitrate contamination.
- Climate change, reducing water flow, would increase river eutrophication.

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#### ABSTRACT

The Grafs-Seneque/Riverstrahler model was implemented for the first time on the Loire River for the 2002–2014 period, to explore eutrophication after improvement of wastewater treatments. The model reproduced the interannual levels and seasonal trends of the major water quality variables. Although eutrophication has been impressively reduced in the drainage network, a eutrophication risk still exists at the coast, as shown by the N-ICEP indicator, pointing out an excess of nitrogen over silica and phosphorus. From maximum biomass exceeding 120 µgChla lin the 1980's, we observed decreasing maximum values from 80 to 30  $\mu$ gChla l<sup>-1</sup> during the period studied. Several scenarios were explored. Regarding nutrient point sources, a low wastewater treatment scenario, similar to the situation in the 1980's, was elaborated, representing much greater pollution than the reference period (2002-2014). For diffuse sources, two agricultural scenarios were elaborated for reducing nitrogen, one with a strict application of the agricultural directives and another investigating the impact of radical structural changes in agriculture and the population's diet. Although reduced, a risk of eutrophication would remain, even with the most drastic scenario. In addition, a pristine scenario, with no human activity within the basin, was devised to assess water quality in a natural state. The impact of a change in hydrology on the Loire biogeochemical functioning was also explored according to the effect of climate change by the end of the 21st century. The EROS hydrological model was used to force Riverstrahler, considering the most pessimistic SRES A2 scenario run with the ARPEGE model. Nutrient fluxes all decreased due to a >50% reduction in the average annual discharge, overall reducing the risk of coastal eutrophication, but worsening the water quality status of the river network. The Riverstrahler model could be useful to help water managers contend with future threats in the Loire River, at the scale of its basin and at smaller nested scales.

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#### 1. Introduction

River water quality, biogeochemical functioning and fluxes of the transformation and transport of nutrients (phosphorus, nitrogen, silica) along the land-to-sea continuum depend on hydrology and human activities in watersheds. It is therefore necessary to take into account the various interactions between these major drivers to assess the ecological status of rivers. These interactions are similar for both past situations and the present, as well as the future when the impact of climate change will interfere with the anthropogenic pressures resulting from urban and agricultural activities (Ducharne et al., 2007).

Due to the complexity of these interactions, only a modeling approach can make the link between hydrology, anthropogenic land-based emissions and the resulting water quality. The Seneque/ Riverstrahler model was first developed for the Seine River (75,000 km<sup>2</sup>) within a 30-year long-term program (PIREN-Seine, Billen et al., 1994; Garnier et al., 1995; Ruelland et al., 2007) but simultaneously implemented for a variety of regional watersheds, including the Somme and the Scheldt rivers (Thieu et al., 2009; Passy et al., 2013), which differ in the size of their basin and their population density, the Kalix (Sferratore et al., 2008) and the Hong Rivers (Le et al., 2010, 2014), located in contrasting climates, cold and monsoon, respectively. The Seneque/Riverstrahler model has proved to be well adapted to examining the water quality of all of these rivers. Also, in order to explore water quality scenarios beyond the impact of point sources from wastewater treatment plants (WWTPs), a new approach, Grafs (Generalized Representation of the Agro-Food System), was coupled with the Seneque/Riverstrahler model, to determine agricultural scenarios by focusing on nitrate contamination, which is today a major problem in the drainage network in terms of producing drinking water for people (440 wells were closed in France between 1998 and 2008, Direction Générale de la Santé, 2012) and for preserving biodiversity (vegetal, James et al., 2005; and animal, Camargo et al., 2005). At the coastal zone, excess nutrients delivered by the river (especially nitrate) lead to eutrophication and harmful algal blooms, both potentially damaging for various economic activities (Justić et al., 1995; Billen and Garnier, 1997; Cugier et al., 2005; Heisler et al., 2008; Viaroli et al., 2008; Lancelot et al., 2011; Howarth et al., 2011; Davidson et al., 2014; Passy et al., 2016).

In this paper, the objective was to explore scenarios for further improving the water quality of the Loire River, although eutrophication has been considerably reduced in the past two decades (Minaudo et al., 2015, 2016). The Loire Basin is an intensive agricultural basin, mainly in its central sector as a part of the rich loamy soils of the Paris basin (Beauce region), with nitrate contamination of surface waters and the associated problem mentioned above (Dupas et al., 2013; Poisvert et al., 2017). Also, the Middle and Lower Loire River are highly sensitive to eutrophication because multiple channels and the pattern of sandbars, combined with a low water level in summer, increase water residence time and water temperature (Moatar and Gailhard, 2006; Latapie et al., 2014). In the 1980's, the Loire was highly eutrophic, with chlorophyll peaks exceeding  $120 \ \mu gl^{-1}$  for 3 months in summer (Crouzet, 1983), daily dissolved oxygen variations up to 12 mg  $l^{-1}$  and pH reaching 10 units (Moatar et al., 1999, 2001).

The Seneque/Riverstraher model was therefore newly implemented on this second largest watershed in France. We elaborated agricultural scenarios to be compared with the reference period, taken from 2002 to 2014, to assess the extent to which changing agriculture can be used as a lever for improving water quality. Also, considering the strong decrease in discharge predicted by the climate scenario, we examined the impacts induced by a change in hydrological regimes on the biogeochemical behavior of the Loire River.

#### 2. Study site and methods

#### 2.1. The Loire River

The Loire River basin is one of the largest of the North Atlantic coast line (117,045 km<sup>2</sup>). The source of the Loire River is located at Le Mont Gerbier-de-Jonc (elevation, 1412 m), southeast of the Massif Central mountains. The mean annual water flow is 830 m<sup>3</sup> s<sup>-1</sup> at the Montjean-sur-Loire outlet of the catchment, with an average flow of 1540 m<sup>3</sup> s<sup>-1</sup> in February and 250 m<sup>3</sup> s<sup>-1</sup> in August, with already observed irregular flood events up to 7000 m<sup>3</sup> s<sup>-1</sup> and dry periods with about 20 m<sup>3</sup> s<sup>-1</sup> in the Middle Loire (200 km upstream of Montjean-sur-Loire), (Table 1).

The Loire River is less managed than the other large French rivers, although two major reservoirs slightly modify its flow in the Upper Loire (Grangent: Latour et al., 2004; Villerest: Bonnet et al., 2000).

Due to its wide watershed, the hydroclimatic characteristics of the Loire Basin range from humid mountains to temperate oceanic. The population density is rather low from 50 inhabitants.km<sup>-2</sup> to 150 inhab.  $\text{km}^{-2}$  in the downstream sector (63.6 inhab.  $\text{km}^{-2}$  on the whole in 2015). The Loire Basin's main stem comprises three major cities (Orléans, Tours and Angers, from 400,000 to 500,000 inhab., including their agglomeration), in addition to Nantes located on the estuary with 870,000 people, including the whole conurbation. Land occupation comprises 30% arable area (mostly in the central part of the Loire basin), 42.3% grassland and 23.7% forest, the remaining being urban zones (3.5%) and surface water and wetlands (0.5%), (Table 1). To analyze the results of the modeling approach, the Loire can be split into one major axis from the confluence of the Loire and Allier rivers and seven sub-basins (Upstream Loire, Allier, Cher, Indre, Vienne, Thouet and Maine rivers), although the resolution of the model was more detailed (Fig. 1 and see below).

#### 2.2. Implementing Seneque/Riverstraher on the Loire River

#### 2.2.1. The biogeochemical model

Riverstrahler calculates spatial and temporal variations of the discharge and water quality (nutrients), taking into account a generic representation of ecological functioning for the whole hydrographic network, as a function of the constraints given by the morphology of

#### Table 1

General characteristics of the Loire River for the period studied (2002-2014).

General characteristics of the Loire River (2002–2014)	Units	Values
Surface area at Montjean-sur-Loire (including the estuary)	km <sup>2</sup>	110,518 (117,045)
Elevation at the source	m	1412
Mean annual flow at Monjean-sur-Loire (min and max montly means)	$m^{3} s^{-1}$	830 (250 in August-1540 in February)
Total population at Montjean-sur-Loire (including the estuary)	Inhabitants	6,855,230 (7,441,102)
Mean population density at Montjean-sur-Loire (including the estuary)	Inhabitants.km <sup>-2</sup>	62 (63.6)
Cropland area	%	30.0
Grassland area	%	42.3
Forest	%	23.7



Fig. 1. Loire Basin, location in the North Atlantic coast line and its major cities. The main tributaries of the hydrographic network and measurement stations as represented in the modeling approach and hydrographic network are also indicated: numbers 1–4, stations on the course of the Loire; 5–8, stations of major sub-basins.

the drainage network (e.g., length and depth of the rivers), the meteorological and hydrological conditions, as well as the inputs related to land use (diffuse sources) and from domestic urban and industrial wastewater (point sources) (Fig. 2). Seneque is the software in which the Riverstrahler model is imbedded into a GIS environment (Ruelland et al., 2007).



Fig. 2. Representation of the principles of the Grafs-Seneque-Riverstrahler modeling approach.

GRAFS

The module representing biogeochemical functioning (namely RIVE, www.fire.upmc.fr/rive) takes into account three compartments of phytoplankton, two compartments of bacteria and two compartments of zooplankton. RIVE also takes into account the transformation of major nutrients (Si, P, N) and calculates oxygen and carbon concentrations in the water column and at the water/sediment interface, on a seasonal scale.

The three compartments of phytoplankton mathematically formalized in the RIVE module are the Diatoms, the Chlorophyceae and the Cyanobacteria, which often dominate in freshwater systems. Unlike stagnant systems, river waters are not favorable for Cyanobacteria growth, which can, however, be brought to the rivers in communication with ponds, reservoirs, dead arms, etc. Phytoplankton dynamics (growth, mortality, excretion, grazing) have been described previously (Lancelot et al., 1991; Garnier and Billen, 1993; Garnier et al., 1998). The model comprises 30 variables for which the kinetics of transformations and parameter values have been described in Garnier et al. (2002). As kinetics and parameters of the processes were independently determined, and not adjusted by calibration, the comparison between simulations and observations represents a true validation of the model. The calculation time step is 10 min, but the time resolution of the results provided is 10 days.

#### 2.2.2. Representation of the hydrographic network

The structure of the Seneque GIS framework requires a detailed description of the hydrographic network for which we identify the elementary basins (EBs) with their own characteristics (slope, width, length) within the upstream–downstream scheme of river confluences. This structuring of the Loire River's drainage network was obtained from the IGN database (CarTHAgE®) and from an elevation model (50 m, http://professionnels.ign.fr/bdalti) (Fig. 1). A total of 5226 EBs were considered.

#### 2.2.3. Model inputs

2.2.3.1. Hydrology. Hydrological data are those provided by the HYDRO database (http://www.hydro.eaufrance.fr), averaged at a daily time step and then broken down into surface runoff and base flows, using the Bflow recursive filter (Lyne and Hollick, 1979; Arnold and Allen, 1999 for the method and informatics program, respectively). Surface runoff and base flows were generated using observed discharge time series at 63 gauging stations for the 2002–2014 period, for each elementary sub-basin and main stems considered for the modeling project

(here 42 sub-basins and 12 main stems). These basins were then grouped by large tributaries with the Loire River valley as a main stem (Fig. 1).

To explore the role of hydrology under climate change on the biogeochemical behavior of surface water, we selected the most pessimistic climatic scenario (i.e., the highest expected CO<sub>2</sub> emission increase) among the many calculated (Moatar et al., 2010) in terms of discharge perturbations (here a strong decrease) coming from the hydrological model EROS (BRGM) (Thiéry, 2018). Ten years (2090-2100) of EROS-simulated runoffs resulting from the ARPEGE GCM (General Circulation Model, Déqué et al., 1994) runs forced by the SRES A2 scenario, were chosen within the 2047-2100 period, because it includes a succession of wet and dry years, similar to the reference period studied (2002-2014). For this reference period, EROS used atmospheric variables near the surface from the SAFRAN mesoscale analysis system. The two components of the discharge required by Riverstrahler are those provided by EROS for the 42 sub-basins and 12 main stems considered under the reference and climatic scenarios. Changes in temperature were not taken into account here.

2.2.3.2. Point sources. The water agency (Agence de l'Eau Loire-Bretagne, AELB) provided the domestic effluents for the years 2002 (used for the 2002–2005 period) and 2010 (used for the 2006–2010 period), which were all spatially explicitly implemented in the model (Fig. 3a). From 2011 to 2014, data were extracted from the municipal sanitation information portal (http://assainissement.developpement-durable.gouv.fr/). However, for the ten largest wastewater treatment plants (Angers, Le Mans, Tours, Orléans, Bourges, Limoges, Clermont-Ferrand, Roanne and Vichy), a year-by-year update was carried out from the portal cited above. The total amount of collected effluent represents between 6,447,597 and 9,715,769 inhabitant equivalents (inhab. equ.), Table 2). The discharged effluents were evaluated in terms of phosphorus (P) and nitrogen (N) from the specific treatment of each wastewater treatment plant (WWPT). These changes in specific treatments were selectively applied for the 2002–2014 period (see Table 2).

For industrial point sources, we used the data provided by AELB (2006 data used for 2002–2006; 2012 data used for 2007–2012, and average corresponding data for 2013–2014, included in Table 2).

2.2.3.3. Diffuse sources. The Seneque/Riverstrahler model requires documenting the concentrations of all water quality variables taken into account for the two components of the discharge (surface runoff and base flows).



Fig. 3. a. Location of the wastewater treatment plants (WWTPs) and their treatment capacity (inhabitant equivalent, inhab. equ.) in the Loire Basin in 2002 (AELB). b. Distribution of subroot water nitrate concentrations (mgN l<sup>-1</sup>) calculated for the Loire basin, based on data on land cover and agricultural practices.

#### Table 2

Total net point source effluent input to the river (domestic + industries, in terms of inhabitants equivalent) at the scale of the drainage network for 3 years during the 2002–2014 period studied in terms of discharges, suspended solids (SS), total organic carbon (TOC), total inorganic nitrogen and phosphorus (Tot N inorg, Tot P inorg), in tons per day (t SS, C, N, P d<sup>-1</sup>). The fraction of ammonium to total inorganic nitrogen (N-NH4, %) is indicated, showing the increase in denitrification in the wastewater treatment (i.e., decreased N-NH4).

	Inhabitants equivalent	Discharge	SS	TOC	Tot N inorg	N-NH4	Tot P inorg
		$m^{3} s^{-1}$	t SS $d^{-1}$	t C $d^{-1}$	$t N d^{-1}$	%	$t P d^{-1}$
2003	6,447,597	11	101	52	59	34	10
2009	9,174,428	16	42	39	45	30	3
2013	9,715,769	17	43	41	47	25	3

The approach used for nitrogen is the most sophisticated, because the diffuse sources of this element are dependent on the structure of the agro-food system of the areas composing the watersheds. The major land use classes (cropland, permanent grassland, forests, urbanized areas) were spatially determined using the Corine Land Cover database (Bossard et al., 2000; EEA, 2007) (Fig. 3b). The GRAFS approach (Billen et al., 2014; Le Noë et al., 2017; see Fig. 2) was then used to calculate, from regional agricultural statistics at the "département" level (Nuts 3), nitrogen leaching flux and concentrations (Anglade et al., 2017; Anglade, 2015), for both surface runoff and base flow, for each land use class.

Other diffuse sources of suspended solids are derived from PESERA estimates of soil erosion (Kirkby et al., 2004) and combined with topsoil data from the European LUCAS survey (Toth et al., 2013) to estimate land-based emissions of particulate phosphorus and organic carbon. Dissolved silica concentrations are assigned according to lithomorphological information (European Ecoregions: Wasson et al., 2004) using a simple dichotomy between crystalline and sedimentary rocks (3.6 mg Si L<sup>-1</sup> for sedimentary rocks or recent alluviums and 7 mg Si L<sup>-1</sup> for crystalline or metamorphic rocks, in accordance with the value provided by Meybeck, 1986).

#### 2.3. Validation of the model

The kinetics of the processes and the parameters were determined independently either from our own experiments or from the literature (see Garnier et al., 2002), and are a priori defined. Therefore the comparison between the simulations and observations represents the reliability of the model. Disagreement may be the result of (i) uncertainties regarding constraints and observations or (ii) incomplete understanding of the ecosystem functioning.

Water flow and water quality data (nitrate, ammonium, phosphates, total phosphorus, silica and chlorophyll *a*) were gathered from the Loire-Bretagne Water Agency surveys (2002–2014), available at intervals ranging from monthly to every 2 months (http://osur.eau-loire-bretagne.fr/exportosur/Accueil).

We chose the Montjean-sur-Loire station for a validation at the outlet of the Loire and the entrance of the Loire estuary, the upstream limit of the dynamic tide (see Fig. 1). We also validated the model along the Loire River, and at the outlet of the major tributaries, i.e., seven additional stations (see Fig. 1).

Two indexes of the goodness of fit of the model simulations were calculated: the normalized range of the observations (NRMSE, i.e., a percentage of variation) and the slope of the regression line, forced to zero intercept, between the simulated and observed values (Table 3).

#### 3. Results

#### 3.1. Interannual variations of water flow and quality

#### 3.1.1. Water flow

Despite the 10-day time resolution of the hydrological calculations, the observed and calculated variations of the data agreed well. The 2002–2014 average discharge at the outlet was 830 m<sup>3</sup> s<sup>-1</sup> with e.g., wet (2013: 1219 m<sup>3</sup> s<sup>-1</sup>) and dry years (2011: 457 m<sup>3</sup> s<sup>-1</sup>). On

the seasonal scale, summer low water can fall below 150 m<sup>3</sup> s<sup>-1</sup> and winter high water exceeded 4000 m<sup>3</sup> s<sup>-1</sup> (see Fig. 4). Typically the lowest waters were observed from mid-July to the end of October.

NRMSE and slope indicators for discharge at the eight stations over the 2002–2014 period showed very good agreement between calculations and observations (Table 3).

#### 3.1.2. Water quality variables

NRMSE was <20% for nitrate, ammonium, silica and suspended solids, and reached 25–28% for phosphorus and chlorophyll (Table 3), showing that the levels of values were similarly reproduced for the different variables. However, the slope indicated an overestimation for nitrate and phosphorus and an underestimation for suspended solids and chlorophyll *a*, and a lesser underestimation for silica (Table 3).

Variations in nitrate concentrations at Montjean-sur-Loire, the receptacle of all tributaries of the Loire River, represent the integration of all inputs, transfers and transformations within the drainage network. Simulations of nitrate concentrations fit rather well with the observations, both in terms of seasonal and interannual variations (Fig. 5). Whereas a drop in nitrate (NO<sub>3</sub>) systematically occurred from spring to the end of summer, leading to ample variations in concentrations  $(2-7 \text{ mg N-NO}_3 \text{ L}^{-1})$  explained mostly by riparian denitrification, interannual variations were linked to the discharge, with nitrate originating from diffuse sources. Ammonium (NH<sub>4</sub>), phosphates (PO<sub>4</sub>) and total phosphorus (TP), known to mostly come from point sources, had opposite seasonal variations, with a dilution by high winter discharges and an increased concentration during summer at low river water, because the volume of discharged treated effluent remained rather stable throughout the year. Year-to-year variations showed a decrease in these point source variables, after a full implementation of the EU-UWWD (1991) and EU-WFD (2000). Regarding phytoplankton biomass, expressed in terms of chlorophyll a concentrations, a decrease was observed related to improvement in phosphorus concentrations, from 2008 onwards. Even though the seasonal dynamics were not always adequately described, the general interannual trend was reproduced with an underestimation mainly in the early period of the study (Fig. 5). Dissolved silica concentrations varied in the opposite direction compared

#### Table 3

Evaluation of the Seneque-Riverstrahler performance for the Loire River. The goodness of fit of the simulations with respect to the observed concentration values at 8 the selected stations (cf. Fig. 4) was evaluated for the major variables of water quality by calculating the root mean square error, normalized to the range of the observed data (NRMSE), according to the formula (NRMSE = 100\* SQR(1/n  $\Sigma_4$ (Obs<sub>1</sub>-Sim<sub>i</sub>)<sup>2</sup>)/(MAX(Obsi)-MIN(Obs<sub>i</sub>)) where n is the number of observations Obs<sub>i</sub>). The NRMSE represents a percentage of variation, whereas the slope of the regression line between simulated (Sim) and observed (Obs) values indicates an over- or underestimation.

Variables	Observations (n)	% NRMSE	Slope, Sim vs. Obs (dimension less)
Discharge	29,257	3	1
Nitrate	1047	14	1.2
Ammonium	1048	10	0.5
Total P	1045	26	1.5
Phosphates	1047	28	1.5
Dissolved silica	757	14	0.9
Chlorophyll a	613	25	0.5



Fig. 4. Interannual variations of the discharge for various locations within the Loire River network. Observations are compared with the reconstruction of the discharge after being broken down into surface and base flows, using the BFlow recursive filter.

to algal biomass, because major blooms in rivers are made up of diatoms that consume silica to build their frustule, which was correctly represented by the model (Fig. 5 and SM1).

The Riverstrahler model, with its new module for riparian denitrification (Billen et al., 2018) is able to catch both the winter maximum level of nitrate concentration in the different sectors of the basin with contrasting land use, and their seasonal variations with strongly reduced concentrations in summer. This new approach used a single adjustable parameter representing the potential denitrification rate of wetland soils. The results pointed out the importance played by these riparian systems in decreasing nitric contamination coming from agricultural lands.

The same samples of locations as for Fig. 4 were chosen along the major stem of the river (Fig. 6, left) and certain tributaries with different land use from upstream to downstream (Fig. 6, right). As shown in Fig. 3, the distribution of nitrate sub-root concentrations evidenced a strong water contamination (ground- and surface water) due to intensive cereal cropping in the middle and downstream part of the basin.

Whereas nitrate surface concentrations peaked at 2 mgN-NO<sub>3</sub>  $l^{-1}$  in the upstream basin (Upstream Loire and Allier rivers), concentrations more than doubled in the downstream part, and reached up to the threshold value for drinking water production (11 mgN-NO<sub>3</sub>  $l^{-1}$ ) in the most intensively cropped Beauce Region (e.g., the Loir catchment embedded in the Mayenne sub-basin).

#### 3.1.3. Nutrient deliveries to the Loire estuary and their ratios

Nutrient fluxes at the estuarine zone showed a large variation depending on the hydrological year, higher by a factor of 2.9 and 2.4 for phosphorus and nitrogen, respectively, and 3 for silica when discharge varied by a factor of 2.7 between the driest (2011) and wettest (2013) years (Table 4).

The indicator of coastal eutrophication potential, N- and P-ICEP (Billen and Garnier, 2007) is based on the C:N:P:Si molar ratios of 106:16:1:42 (Redfield et al., 1963; Conley et al., 1989). ICEP can be positive or negative and represents the excess or the deficit of either N or P, respectively, over silica. Silica is essential for diatom growth stemming



Fig. 5. Simulations by the Grafs-Seneque-Riverstrahler model of the seasonal variations of major water quality variables at the outlet of the Loire River network (at Montjean-sur-Loire, namely Montjean). Comparison with observations for nitrate, ammonium, phosphates, total phosphorus, chlorophyll *a* and silica.

from natural rock weathering, differently from anthropogenic inputs of N and P. Whereas the nitrogen flux largely exceeded the silica flux (N-ICEP >0), P-ICEP did not reveal any silica deficit for diatom development (P-ICEP <0), (Table 4). Importantly, this nutrient imbalance of nitrogen fluxes at the coastal zone has been shown to determine the succession of diatoms by non-diatoms, potentially toxic algae (Tilman et al., 1982).

#### 3.2. Exploring possible future scenarios for the Loire Basin

#### 3.2.1. Role of wastewater treatments

Because the implementation of the Urban Wastewater Treatment Directive (UWWTD EU Directive, 1991) prescribing tertiary treatment of nitrogen and phosphorus in wastewater treatment plants is now near completion and has considerably improved phosphorus levels in the Loire River, we explored a scenario for showing the effect of a lower level of treatment in WWTPs, as was the case in the 1980's. Only standard activated sludge treatment was considered for cities above 2000 inhab. equ., while smaller towns were considered to discharge their wastewater without any treatment (Fig. 7). Therefore in this low treatment scenario, 30–40% the total nitrogen and phosphorus load remained untreated.

We also elaborated a theoretical "pristine" scenario assuming no human activity in the watershed, considered entirely covered by forest (Desmit et al., 2018). This scenario provides a baseline corresponding to the natural background of nutrient concentrations.

The highest differences in fluxes were observed for nitrogen, with a factor of 10 between the pristine condition and the 1980's, and half as much for the reference situation as for the 1980's (Fig. 7a). Whereas phosphorus flux was also twofold less for the reference situation than for the 1980's, the level did not show much further decrease for the pristine level. Pristine silica flux was slightly higher than the reference one.

The negative N- and P-ICEP indicated no risk for eutrophication in the pristine scenario, while both N- and P-ICEP were positive in the 1980's (i.e., excess N and P compared to silica), corroborating the eutrophication observed at that time, before tertiary treatment implementation (Fig. 7b).

#### 3.2.2. The impact of agricultural changes

We tested two contrasting agricultural scenarios (Garnier et al., 2018; Desmit et al., 2018). As a first step, we considered the same current conventional rotations, with full application of the current regulations (balanced fertilization following the agronomical recommendation with respect to current yield objectives and catch crop introduction before spring crops, Justes et al., 2012), called good agricultural practices (GAP). The second scenario assumes a radical change in the present agro-food system, in line with the current rapid increase in the demand for organic food and debates around the proportion of animal products in the human diet (Solagro, 2014). We therefore elaborated this scenario by generalizing organic farming in the Loire Basin, based on (i) long and diversified rotations without recourse to mineral fertilizers, (ii) reconnection of livestock and crop farming, using the local forage following the specification for organic cattle breeding and (iii) a human diet based on half the current animal protein ration substituted by grain legumes (the "Autonomous-Organic-Demitarian scenario" Auto-Org-Dem) (Billen et al., 2014; Garnier et al., 2016). Both agricultural scenarios include full compliance with the UWWTD prescriptions.

As expected, no visible changes were observed for phosphorus and silica for the two agricultural scenarios compared to the reference (Fig. 7). Nitrogen-specific fluxes (per km<sup>2</sup>) decreased by 15% and 30% for the GAP and Auto-Org-Dem, respectively. The effect was even higher



Fig. 6. Simulations by the Grafs-Seneque-Riverstrahler model of the seasonal variations of nitrate for various locations within the Loire River network. Comparison with observations.

#### Table 4

Variation in simulated annual average discharge and nutrient flux (nitrogen, N, phosphorus, P; silica, Si) for the period studied (2002–2014) at the outlet of the Loire River network (Montjean-sur-Loire, namely Montjean). The indicator of coastal eutrophication potential (ICEP) is shown for P and N.

Years	$\substack{ Q \\ m^3 \ s^{-1} }$	FlxN ktN yr <sup>-1</sup>	FlxP ktP yr <sup>-1</sup>	FlxSi ktSi yr <sup>-1</sup>	N-ICEP kgC km <sup>-2</sup> d <sup>-1</sup>	P-ICEP kgC km <sup>-2</sup> d <sup>-1</sup>
2002	798	1425	44	1238	14.7	-2.8
2003	857	1551	47	1370	15.8	-3.3
2004	895	1508	48	1398	15.0	-3.4
2005	600	914	33	926	8.6	-2.0
2006	735	1271	34	1143	12.8	-3.3
2007	906	1548	34	1456	15.2	-5.3
2008	1046	1745	38	1757	16.4	-6.7
2009	620	1010	23	979	9.8	-3.5
2010	842	1333	31	1375	12.4	-5.2
2011	457	725	18	701	7.0	-2.4
2012	790	1310	30	1289	12.5	-4.7
2013	1219	2131	44	2068	20.6	-8.1

for N-ICEP, which decreased by 25% and 55% for the GAP and Auto-Org-Dem, respectively (Fig. 7).

The results in N, P and Si concentrations where mapped for the period showing improved water quality (2008–2014) and for the whole drainage network of the Loire River, to compare the reference situation with the two scenarios, 1980's and Auto-Org-Dem (Fig. 8). These maps clearly show a degradation of water quality from upstream to downstream, especially regarding nitrate concentrations for the reference situation. Poor water quality was evident in the 1980's in terms of N and P, and even for silica, which was quite depleted, all resulting in strongly eutrophic conditions, expressed as chlorophyll *a* concentrations.

#### 3.2.3. Effect of climate change on water quality of the Loire River

The pessimistic scenario in terms of discharge perturbations ARPEGE-SRES A2 using the hydrological model EROS (BRGM, Thiéry, 2018) showed a striking reduction of the discharge from 830 m<sup>3</sup> s<sup>-1</sup> on average for the values observed in 2002–2014 (765 m<sup>3</sup> s<sup>-1</sup> on average for the same period when calculated from SAFRAN mesoscale





Fig. 7. a. Specific fluxes, simulated by the Grafs-Seneque-Riverstrahler model of TN, TP and TSi for the reference in 2002–2014, compared with the three scenarios (GAP, good agricultural practices, and Auto-Org-Dem, and the situation in the 1980's) as well as a pristine scenario representing a baseline. b. Indicator for potential eutrophication related to N and P, expressed in specific carbon fluxes for comparison. Results at the Montjean-sur-Loire station (Montjean), the outlet of the Loire River (see Fig. 1).

analysis system) to 320  $m^3\,s^{-1}$  for the 2090–2100 climate projection (Fig. 9).

Riverstrahler was run with the resulting EROS hydrology for two periods (2002–2014 and 2090–2100), for the reference inputs as well as for the 1980's scenarios with low wastewater treatment (1980's) and Auto-Org-Dem with a radical change in the agro-food system. No demographic change was taken into account between the two periods.

Nutrient fluxes delivered at the outlet of the Loire Basin (Fig. 10) with the hydrology resulting from climate change showed a notable decrease due to decreasing discharges. As a result, N-ICEP was reduced to one third of the reference situation, while remaining positive. P-ICEP would not be as negative, since urban effluents are somewhat concentrated with lower discharge. The same trends were observed for the 1980's and Auto-Org-Dem scenarios, with the worst situation without efficient wastewater treatment, and the best one with alternative agriculture.

Focusing on the summer 2008–2014 period, eutrophication in the drainage network which can be still problematic for the reference situation, less for the Auto-Org-Dem scenario, but worse for the 1980's one, is further accentuated under climate change hydrology (Fig. 11a and b). Relaxing efforts in the treatment of wastewater (i.e., coming back to the 1980 situation) would considerably worsen eutrophication at a level already experienced, for the current hydrology and even more under climate change. Whereas a radical change in agriculture (Auto-Org-Dem scenario) appears as the only way to reduce nitrate contamination and considerably weaken the problem of eutrophication in the current hydrology, the effect on eutrophication of such a deep change would be undermined under climate change (Fig. 11). At total, despite eutrophication would be reduced at the marine coastal water under climate

change hydrology, eutrophication within the river drainage network would increase notably, especially with poor treatment in WWTPs.

#### 4. Discussion

The modeling approach implemented at the whole basin scale differs from the several other studies already published on the Loire River, focusing mostly on the middle Loire River (Minaudo et al., 2018; Descy et al., 2011), from the Allier to the Maine rivers, close to the Montjean-sur-Loire outlet station. Taking into account upstream basins (upper Loire and Allier), as well as all tributaries, made it possible to synthesize most of the data available over this large territory covering 20% of France, to quantify nutrient fluxes and eutrophication. Moreover, we elaborated a wide range of scenarios, exploring extreme changes in human management of the watershed related to wastewater treatment and agricultural activities, as well as the possible effect of climate change on the hydrological regime of the river system. These scenarios can guide future management measures (see Sabater et al., 2008).

#### 4.1. The models and their evaluation

The Riverstrahler model has been applied to a large range of rivers size (100 km<sup>2</sup> to 800,000 km<sup>2</sup>) under temperate regime (Garnier et al., 2002, 2016), in a gradient from temperate to Mediterranean climate (Desmit et al., 2018), and for subtropical (Le et al., 2014) and cold rivers (Sferratore et al., 2008) analyzing nutrients fluxes and eutrophication at the scale of whole watershed, with the same sets of equations and parameters, proving therefore its robustness. No calibration other than the range of the determination of the parameters is



**Fig. 8.** Annual averaged concentrations of nitrate ( $NO_3$ ,  $mgN l^{-1}$ ), phosphates ( $PO_4$ ,  $mgP l^{-1}$ ), dissolved silica ( $mgSi l^{-1}$ ) and concentrations of chlorophyll ( $\mu g chla l^{-1}$ ) for the 2008–2014 period, distributed within the drainage network of the Loire River for two scenarios (Auto-Org-Dem and 1980's) compared to the reference.

necessary. It has also been used for exploration of a large variety of scenarios regarding domestic or agricultural pollution (Thieu et al., 2010; Passy et al., 2016). Several river models exist in literature, based on statistical approaches (GREEN, Grizzetti et al., 2012) or are more hybrid, both process- and statistics-based (SPARROW, Alexander et al., 2002; MONERIS, Venohr et al., 2011). These models were used for estimating the global distribution of nutrients export from large river. Fully based-process models such as SWAT (Arnold et al., 1998; Malagó et al., 2017), RiNUX (Loos et al., 2009) require calibration procedures, whereas Riverstrahler (Billen et al., 1994; Garnier et al., 2002; Garnier et al., 2018), PEGASE (Descy et al., 2011) and QUAL-NET (Minaudo et al., 2018) are more generic. When metrics are calculated for evaluating these models, NRMSE, slopes or biases are chosen. However, most of the model evaluation relies only on a single station at the outlet of the watershed (Wellen et al., 2015). A better performance is necessarily expected for a model describing a stretch of river (Minaudo et al., 2018, specifically for Loire River) than for other at a whole watershed scale (e.g., Malagó et al., 2017, for the Danube) as it is the case in our study.

#### 4.2. Wastewater treatment and eutrophication reduction

Exactly as was the case for many other European rivers, the Loire River was severely eutrophied in the 1980's (Moatar and Meybeck,



Fig. 9. a. Interannual variations of the discharge at the outlet of the Loire River (Montjean-sur-Loire, Montjean) from the EROS model forced by SAFRAN data for the 2002–2014 period. b. Comparison with the EROS values obtained for the ARPEGE SRES A2 scenario of climate change (CC) for the 2090–2100 period.

2005). The successful implementation of European directives, namely UWWTD (Urban wastewater treatment Directive, 91/271/CEE UWWD, 1991) and the WFD (Water Framework Directive, 200/60/CE, 2000), led to a substantial reduction of algal development and hence eutrophication in the main stems of many European rivers. In the Loire River, whereas algal blooms recurrently exceeded 120 µg chl *a* in the 1980's (Crouzet, 1983; Floury et al., 2012; Minaudo et al., 2015), values at the Montjean-sur-Loire station peaked at 80 µg chl *a* in the early 2000s, with the maximum values reduced to 50 µg chl *a* in the last years of the period studied (2008–2014). This change was clearly linked to the reduction in phosphate loading, with concentrations reaching 0.2 mgP-PO<sub>4</sub>  $I^{-1}$  (mean, 0.05 mgP-PO<sub>4</sub>  $I^{-1}$ ) for 2002–2005, and decreased to a maximum 0.1 mgP-PO<sub>4</sub>  $I^{-1}$  (mean, 0.03 mgP-PO<sub>4</sub>  $I^{-1}$ ) for 2009–2012. Exactly as observed on the Seine River, the response

in eutrophication was not linear with phosphate elimination in wastewaters (Passy et al., 2013; Aissa Grouz et al., 2016), phytoplankton continuing to form blooms as long as phosphorus was not limiting, i.e., <0.05 mgP-PO<sub>4</sub> l<sup>-1</sup> according to the half-saturation constant (Garnier et al., 1995). Despite the role of *Corbicula* invasion that has been cited to explain a phytoplankton biomass decrease in the Loire River following Brancotte and Vincent (2002), no information is currently available regarding the population density of this benthic filter feeder mollusk and its dynamics (see Floury et al., 2012). The Riverstrahler model, which takes into account a realistic benthic filtration since Garnier et al. (2000), clearly showed here that reducing phosphate loading plays a major role on phytoplankton development once its concentration has reached limiting values. However, the system can be still exposed to eutrophication when wastewater is



Fig. 10. a. Specific averaged fluxes, simulated by the Grafs-Seneque-Riverstrahler model of TN, TP and TSi for 2002–2014 (current hydrology) and comparison with the values obtained for the ARPEGE SRES A2 scenario of climate change for the 2090–2100 period (Climate change hydrology). The results of the model are compared for these two hydrological situations for the reference situation (current inputs) and for the Auto-Org-Dem, and the situation in the 1980's scenario at Montjean-sur-Loire station (Montjean), the outlet of the Loire River. b. N-ICEP and P-ICEP are also shown for current and climate change hydrology.



**Fig. 11.** a. Summer average of concentrations of chlorophyll (µg chla l<sup>-1</sup>) distributed within the drainage network of the Loire River from May to October, under the current hydrology for the 2008–2014 period for the reference situation (Ref) and for two scenarios (Auto-Org-Dem and 1980's). b. Summer average of µg chla l<sup>-1</sup> for Ref and Auto-Org-Dem and 1980's scenarios, under climate change hydrology.

"concentrated" in low water fluxes. This situation was observed in 2011 in the Seine River, although phytoplankton development was already limited from 2008 onward (Aissa Grouz et al., 2016).

Major remarkable changes already reported regarding improvement of eutrophication concerned a phosphorus decrease for most large rivers of the Atlantic and North Mediterranean coasts (Romero et al., 2013; Abbott et al., 2018), even at the whole EU scale where nitrogen did not change much, so that the N:P ratio increased (Grizzetti et al., 2012).

#### 4.3. Nitrate contamination due to long-lasting diffuse pollution

Nitrogen concentrations in the Loire River remained stable for the period studied here, as has been the case since the 1980's (Minaudo et al., 2015). This showed that the wastewater treatment efforts did not affect nitrogen as much as phosphorus, simply because a high proportion of nitrate comes from diffuse agriculture sources. The EU Nitrate Directive 91/676/CEE (European Council, 1991), imposing regulations on agricultural practices, has not yet been efficient in decreasing surface

and groundwater contamination due to agricultural N pollution. Yet, Lassaletta et al. (2014) showed a reduction in applied nitrogen fertilizers in the 1990's at the country scale from 180 to 200 kgN ha<sup>-1</sup> yr<sup>-1</sup> to 150–160 kgN ha<sup>-1</sup> yr<sup>-1</sup> in the 2010's, with more efficient nitrogen use. The same trends have been observed for the Loire Basin (Poisvert et al., 2017; Le Noë et al., 2017). The delayed response of nitrogen may be due to the residence time of the aquifers on the order of 30–50 years (Flipo, 2005) in the Central Loire basin, in much the same way as the Seine basin, and to the migration time of excess fertilizers from soil to aquifers. Nitrate accumulation in the aquifers must be considered as a legacy related to an excess of fertilization for agriculture intensification from the 1950's. Consequently, any effort made by farmers in fertilizer applications and practices since the 1990's in this part of the basin would be noticeable in the next decade at the earliest.

On the other hand, nitrate elimination at the riparian interface between ground- and surface water can reach 15% of the diffuse sources, and a further 15% can be eliminated based on in-stream benthic denitrification, as taken into account in the model (Billen et al., 2018). Nitrate concentrations were reliably reproduced by the model both in terms of the interannual high winter level and seasonal variations with their substantial summer reduction. Interestingly, when not taking into account riparian denitrification, amplitude of nitrate variations were not captured (not shown, but see Billen et al., 2018), showing that this riparian process, rather than algal uptake, is responsible for the low nitrate levels in summer, as questioned by Minaudo et al. (2015). The maximum nitrate concentration reduction due to uptake by an algal bloom of 100 µg Chla l<sup>-1</sup>, taking into account a C:N = 106:16 (molar Redfield Ratio) and a C:Chla ratio of 30, would be about 0.5 mgN l<sup>-1</sup>, much lower than the 5–6 mgN-NO<sub>3</sub> l<sup>-1</sup> observed.

Riparian and benthic in-stream denitrification, however, is greatly reduced in intensity during winter high-water periods due to low temperatures, which strongly reduced their effect on the annual budget of nitrogen delivery to coastal zones.

#### 4.4. Combatting eutrophication and nitrate contamination

Eutrophication in the Loire River has been efficiently combatted in the last two decades through phosphate reduction, first when phosphates were banished from washing powder in the late 1980's in France and then when phosphate treatment of wastewater was improved in the 2000's. Further P loading reduction is expected in the near future due to the regulation of dishwashing detergents (Official Journal of the European Union Regulation, 2012), which still account for 20% of total domestic waste. Besides P point sources, diffuse inputs from erosion must be avoided by adapted agricultural practices and wetlands/riparian zones restoration (Dorioz and Trevisan, 2013). Also, P dynamics and release of dissolved P downslope in riparian zones should be taken into account (Gu et al., 2017). However, a major issue would be to avoid any disengagement from local communities in the treatment of domestic or industrial wastewaters. The scenario of lower sanitation showed a return to the conditions of the 1980's. This situation could occur with population settlement and/or development of tourism activity in this region of the Loire Valley, considered the most attractive of northern France (low population density, pleasant climate) with the Middle Loire now registered as a United Nations Environmental, Scientific, and Cultural Organization (UNESCO) World Heritage Site (Breting-Garcia, 2014).

Reducing nitrate contamination is a major challenge, especially in the middle part of the basin where its fertile land sustains intensive cereal cultivation. Good agricultural practices (GAP), as recommended by Comifer (Comité Français d'Étude et de Développement de la Fertilisation Raisonnée, i.e., French Committee for the Study and the Development of Rational Fertilization Practices, created in the dark years of the 1980's, as far as environment is concerned), have not been able to considerably reduce nitrate pollution (13% in average for all the stations compared to the Reference). Changing the structure of the agro-food system appears to be the only way to further decrease nitrate flux (34%), with a reduced risk of eutrophication at the coastal zone, as shown by the N-ICEP value, closer to zero, i.e., tending to N:Si equilibrium regarding the marine algae requirement. The radical change explored with the Auto-Org-Dem scenario, which assumes organic agriculture, with part of forage dedicated to local livestock within the limit of cattle loading specified by organic agriculture regulations and a demitarian human diet, would respond to the local food demand and would allow exporting cash crops and animal products to more populated regions such as the Ile-de-France region.

Despite our assumption of a reduction of animal proteins in the diet converge with the view reported by Clark and Tilman (2017) for a sustainable agriculture, our study also showed, differently from these authors, that generalizing organic farming would reduce eutrophication (based on our indicator taking into account N:P:Si ratios rather than only P). In addition to eutrophication, other environmental benefits of our scenario would be less NO<sub>3</sub> leaching to groundwater resources, a reconnection of crop and livestock farming, and the banishment of pesticides, the adverse effects of which are well demonstrated for public health (Cimino et al., 2017) and biodiversity (Camargo et al., 2005; James et al., 2005). In addition, we experimentally showed, for the north of France, a decrease in N<sub>2</sub>O emissions under organic farming (Benoit et al., 2015). In the line of Clark and Tilman (2017) however, our scenario needs to be further explored for other climatic and soils conditions, including low-income countries rather that the rich ones of the north of France, studied here.

## 4.5. Hydrological impact on ecological functioning of the river under climate change

We used here the SRES A2 scenario (Special Report on Emissions Scenarios) from the previous IPCC reports (2001 and 2007), although a new approach was adopted in the 5th IPPC report (2014) with the definition of four Representative Concentration Pathways (RCP). Although RCP scenarios cover a longer period than the four A1, A2, B1 and B2 families (up to 2300 vs. 2100 respectively) these scenarios are comparable, with RCP8.5 close to the A2 scenario, being the most pessimistic in terms of  $CO_2$  emissions (Ouzeau et al., 2014).

The hydrological model EROS (BRGM, Thiéry, 2018) was forced with the results of the ARPEGE GCM (General Circulation Model, Déqué et al., 1994) run for the A2 scenario and downscaled with a statistical method (Boé et al., 2009).

This scenario considered the ecological impact of climate change though hydrological conditions only. The population variable was not modified and temperature values were kept similar to reference values.

The available population estimates increase for the Loire Basin at the Horizon 2050 (INSEE, https://www.insee.fr/fr/statistiques/2867738) is about 0.17% yr<sup>-1</sup>, which would mean about 5 inhab.  $\rm km^{-2}$  more than the 63.6 inhab.  $\rm km^{-2}$  for 2015. Considering sanitation efficient enough according to complementary directives or recycling alternative management of human excretion (Esculier, 2018; Esculier et al., 2018), this population increase might not significantly modify nutrient inputs to the river.

Regarding temperature, mean water values have indeed already increased by 2.4 to 3 °C in spring and summer since 1975 (Moatar and Gailhard, 2006; Boé et al., 2009; Bustillo et al., 2014). Since temperature is an important factor controlling biological processes, it deserves more attention in this modeling approach. However, a myriad of other factors influence phytoplankton development such as nutrients, light, hydrology and top-down control by animals. Hydrology has been shown to be a major factor in river water, with phytoplankton biomass increasing when the growth rate is superior to the dilution rate by the discharge (Garnier et al., 1995). In addition, heavy rains during a bloom can lead to its collapse (Garnier et al., 1991). Therefore, taking hydrology as the main factor of change appears relevant in the first step. Also, this stepwise approach can disentangle the respective contribution of a change in hydrological regimes, independently from other climate-impacted variables. Whatever the scenarios tested, present conditions, radical change in agriculture or a low level of wastewater treatment similar to that in the 1980's situation, a decrease in discharge logically decreases nutrient fluxes. Because changes in nutrient fluxes are not proportional to the discharge, with point sources behaving differently from diffuse sources, imbalance in nutrients would be modified in such a way that the risk of coastal eutrophication would be close to zero, surprisingly, as shown by the N- and P-ICEP. However, climate change would have an adverse effect within the drainage network by worsening eutrophication in spite of the major improvements already obtained through implementation of enhanced wastewater treatment. Lower discharges, and hence higher residence times of the water, would modify the distribution of algal development in the network, promoting upstream blooms. Such an algal development would be made possible by less dilution of nutrients from point sources, at low waters.

Interestingly, the hydrological impact under climate change on the ecological functioning of the Loire River would differ from that obtained for the Seine, where N and P fluxes would increase as well as ICEP

values, with an overall increase by a few percent of the annual discharge (Raimonet et al., 2018). Differences between the Seine and the Loire rivers are not surprising considering their respective average discharge that would converge to a same level by the end of the 21st century, with a Loire Basin's population kept identical to the present one, i.e., half that of the Seine (with no change either).

#### 5. Conclusions

In contrast to numerous previous studies focusing on the middle Loire Valley, the Grafs-Seneque-Riverstrahler modeling approach summarizes data at the scale of the entire watershed to analyze nutrient contamination and eutrophication risk. Thanks essentially to improvement of wastewater treatment following the implementation of the UWWD and EU-WFD mainly focusing on decreasing phosphorus loading, eutrophication of the Loire River has been considerably reduced. The period studied was here limited to 13 years, but once data are available on constraints and validation, the approach can be applied to longer periods in the past, as done for the Seine River (Passy et al., 2013). Instead, the modeling approach has been used here to explore scenarios showing that any relaxation in wastewater treatment would lead to returning to the situation that existed in the 1980's, while only a deep change in the agro-food system would reduce the risk of eutrophication at the coast. Under climate change, despite a reduction of coastal eutrophication, river eutrophication would considerably increase, which highlights the need for both reducing nitrogen fluxes with deep agricultural changes and further treating phosphorus point sources.

As developed by Jarvie et al. (2018), we showed here how both P and N inputs to surface waters must be taken into account to limit water degradation and eutrophication along the river aquatic continuum.

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