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Assessing Recovery from Acidification of European Surface Waters in the Year 2010: Evaluation of Projections Made with the MAGIC Model in 1995

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Supporting Information

ABSTRACT: In 1999 we used the MAGIC (Model of Acidification of Groundwater In Catchments) model to project acidification of acidsensitive European surface waters in the year 2010, given implementation of the Gothenburg Protocol to the Convention on Long-Range Transboundary Air Pollution (LRTAP). A total of 202 sites in 10 regions in Europe were studied. These forecasts can now be compared with measurements for the year 2010, to give a "ground truth" evaluation of the model. The prerequisite for this test is that the actual sulfur and nitrogen deposition decreased from 1995 to 2010 by the same amount as that used to drive the model forecasts; this was largely the case for sulfur, but less so for nitrogen, and the simulated surface water $[NO_3^-]$ reflected this difference. For most of the sites, predicted surface water recovery from acidification for the year 2010 is very close to the



actual recovery observed from measured data, as recovery is predominantly driven by reductions in sulfur deposition. Overall these results show that MAGIC successfully predicts future water chemistry given known changes in acid deposition.

1. INTRODUCTION

During much of the 1900s large regions of Europe suffered from the effects of acid deposition, due to the emissions of sulfur and nitrogen oxides to the atmosphere.¹ Long-range transport of air pollutants caused acidification of surface waters with loss of fish and other damage to biota.² In 1979 the LRTAP Convention under the auspices of the United Nations Economic Commission for Europe (UNECE) was established with the aim to reduce the emissions of sulfur and nitrogen.³ Since the mid-1980s a series of protocols have been implemented, and the emissions of sulfur and nitrogen have been reduced substantially.^{4,5} In response, acidified surface waters have shown widespread chemical^{6,7} and to a lesser extent biological recovery.^{8–10}

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Research on the acidification of soils and waters led to the development of process-oriented acidification models. One of these, MAGIC (Model of Acidification Of Groundwater In Catchments),^{11,12} has been extensively used to simulate historical and future trends in surface water acidification at sites and regions around the world.^{13,14}

In 1999 a major European research project, RECOV-ER:2010,^{14,15} was started with the aims to document the recovery in surface water acidification 1970–2000,¹⁶ and to use MAGIC to forecast the future changes expected if the Gothenburg Protocol to the LRTAP Convention was implemented by the year 2010, as agreed.¹⁷ A total of 202 sites in 10 European regions were studied. At each site MAGIC was calibrated to observed data for the years 1994–1996, and forecasts were made for the year 2010 to represent the time of implementation for the Gothenburg Protocol (average 2008– 2010).

Now, 15 years later, we revisit these MAGIC forecasts to determine if the predictions made in 1999 indeed came true. First we compare the projected deposition of sulfur and nitrogen in 2010 with the actual measured values. Then we check that the simulated surface water concentrations of the strong acid anions SO_4^{2-} (sulfate) and NO_3^{-} (nitrate) agree with the MAGIC forecasts. And finally we compare the simulated with observed values for acid neutralizing capacity (ANC) in the waters. This is the first paper of its kind to report on testing long-term MAGIC model predictions against actual observations at a European scale.

2. MATERIALS AND METHODS

2.1. Sites. The 202 sites in 10 regions cover a wide range of acid-sensitive landscapes, from high-altitude alpine meadows and rocky catchments in the Italian Alps and Tatra Mountains of Slovakia and Poland, to Central European and Scandinavian forests, to peaty moorlands and forested sites in the UK (Figure 1, Table 1). The catchments typically have podzolic soils derived from highly siliceous primary minerals, with low rates of chemical weathering. Waters are dilute with low alkalinity. Additional details are given by Jenkins et al.¹⁷ The number of sites analyzed here differ from the number of sites modeled in the 2003–2004 publications (Table 1) because not all sites were monitored during the period 1995–2010 due to resource limitations.

2.2. Data Sources. For this study we used the MAGIC forecasts made in 1999 for the individual sites. The 1999 forecasts were driven by the projected sulfur and nitrogen deposition over the period 1995-2010 as calculated by the EMEP (European Monitoring and Evaluation Programme) Lagrangian acid deposition model.²⁷ EMEP is part of the LRTAP Convention. This old version of the EMEP model gave estimates of average deposition for sulfur and nitrogen in each 150 km \times 150 km grid square covering Europe. Data were supplied at 5year intervals²⁷ and were computed by assuming identical average meteorological conditions each year. Values were obtained for the calibration year 1995 and the year 2010 under the assumption that the Gothenburg Protocol and other current legislation were fully implemented (the CLE scenario).⁴ The regional estimates of 1995 sulfur deposition were scaled to match observed concentrations of SO_4^{2-1} in surface water at each site, after first subtracting the seasalt contribution and the natural background contribution (details in ref 17). The deposition of NO_x (sum of oxidized species of nitrogen) and NH_y (sum of reduced species of nitrogen) were then calculated from the $NO_r/$ S and NH_v/S ratios in the EMEP data and the scaled sulfur

Article



Figure 1. Map of Europe showing the location of regions.

 Table 1. Study Regions with Key References for Previously

 Published MAGIC Forecasts

region	waterbody	no. of sites	ref(s) for MAGIC forecasts
Scotland, UK	lakes	42	18
Norway	lakes	31	19,20
northern Sweden	lakes	32	21
southern Sweden	lakes	32	21
Finland	lakes	24	22
Slavkov Forest, Czech Republic	rivers	2	23
Bohemian Forest, Czech Republic	lakes	3	24
Tatra Mountains, Slovakia	lakes	30	25
Alps, Italy	lakes	4	26
northern Italy	rivers	2	26

deposition at each site. Total inorganic nitrogen (TIN) is defined as $NO_x + NH_y$. Depositions for the year 2010 were calculated from the percentage change between 1995 and 2010 in the EMEP data sets.

To check if changes in sulfur and nitrogen deposition at the sites from 1995 to 2010 were similar to the declines projected by the EMEP model under the CLE scenario, we obtained measured deposition data for one or more stations in each of the 10 study regions. These stations are operated by various national agencies, in most cases as part of the EMEP network.

Measurements of lake and stream chemistry for the period 1995–2010 likewise came from national monitoring programs, in many cases as part of the International Cooperative Programme on Assessment and Monitoring Effects of Air Pollution on Rivers and Lakes (ICP-Waters), part of the LRTAP Convention. Where hydro-chemical analysis took place outside the ICP-Waters network, standard protocols were followed in quality assured laboratories.



Figure 2. Deposition of (a) xSO_4^{2-} and (b) total inorganic nitrogen (TIN) for 2009 as projected by the EMEP model assuming full implementation of the Gothenburg protocol and other legislation (CLE scenario) and as observed at one or more stations in each of the 10 regions studied.

For surface waters, a set of three key variables are considered: acid neutralizing capacity (ANC), xSO_4^{2-} (non-marine sulfate), and NO3⁻. ANC was defined as the difference in the equivalent sum of base cations (calcium (Ca), magnesium (Mg), sodium (Na), potassium (K)) and acid anions (chloride (Cl), sulfate (SO_4^{2-}) , nitrate (NO_3^{-})). The variables selected illustrate the main surface water responses to changes in acid deposition, with xSO_4^{2-} and NO_3^{-} representing the major acidifying anions, and ANC providing a measure of surface water acidity and a link to biota. Gran alkalinity was used instead of ANC to evaluate the model performance for Bohemian Forest sites.²⁴ Gran alkalinity was determined according to Mackereth et al.²⁸ All references to SO42- in deposition and surface water in this paper refer to xSO₄²⁻ except for sites in Italy, Czech Republic, and Slovakia, where $SO_4^{2^-}$ is reported as these sites are remote from coastal areas with negligible sources of Cl. River and lake sites in Italy share the same deposition data.

2.3. Data Analysis. The changes in observed and simulated deposition (flux) and surface water chemistry (concentration) between 1995 and 2009 were calculated as the average of values in 2008-2010 minus the average of 1994-1996. For surface water chemistry, this was performed per site in the region (as defined as a collection of sites within a country), and values were averaged to give the regional mean (Δ). The standard deviation (σ) between sites within each region (where the number of sites is >4) was also calculated (Table 2). Simulated deposition fluxes (EMEP with CLE scenario) were generally only available on a 5 year basis, so the start year was taken as 1995. The 2009 value was gained by linear interpolation between the 2005 and 2010 points. 2009 was chosen as the end year, as the majority of regions had observed deposition data until 2009 only. These start and end years were chosen to maximize the data interval while also maximizing the number of regions with observations. As a result, not all regions had data to be averaged for all three of the start/ end years, in which case the average of the available years was used. The number of sites used in the regional averaging is given (Table 2, below).

Correlations between projected and observed surface water chemistry for 2009, and for differences between 2009 and 1995, were calculated, and the significance of the correlation coefficient was assessed. Where there were sufficient sites in a region, this was done for individual regions (Table 3, below). A high correlation between projected and observed values simply indicates the ability of the model to predict relative concentrations at different locations, while the correlation between predicted and observed changes provides a better indicator of the predictive ability of the model. Paired *t* tests were also carried out to assess whether there were significant differences between the means of the observed and projected values for 2009 and of changes from 1995 to 2009.

2.4. MAGIC Model. The MAGIC model was developed to predict long-term effects of acid deposition on soil and surface water chemistry.^{11–13} MAGIC calculates annual or monthly concentrations of ions in soil solution and surface water using mathematical solutions to simultaneous equations describing sulfate adsorption, cation exchange, dissolution–precipitation speciation of aluminum, and dissolution–speciation of inorganic and organic carbon. The model accounts for the mass balance of major ions by simulating ionic fluxes from atmospheric inputs, chemical weathering, net uptake in biomass, and loss to runoff.

3. RESULTS

3.1. Deposition. The first step in the analysis is to compare the year 2009 deposition of sulfur and nitrogen, and the decreases in deposition from 1995 to 2009, projected by the EMEP model given the CLE scenario, with the actual observed deposition (average values for the years 1994-1996 and 2008-2010). This is to check how closely the actual measured deposition from the calibration year (i.e., 1995) to the present (i.e., 2008-2010) match the deposition sequences used in the MAGIC forecasts. The projected surface water chemistry cannot be expected to match the observed, if the driver of change, the deposition of sulfur and nitrogen, used in the model was not similar to the observed (Supporting Information, Figure S1). A large deposition gradient is represented in this European assessment with the lowest deposition in Scandinavia and Scotland and the highest in Slovakia, Czech Republic, and Italy (Figure 2). Sites that historically received high anthropogenic deposition also exhibit the highest reduction in sulfur and nitrogen emissions and deposition (Figure S1). For example, the present sulfur emissions in central Europe (mostly in postcommunist countries) decreased by 90% and are lower than in 1900. Also NO_x emissions declined by \sim 50% (to the levels of the 1960s), and NH₃ emissions are lower than in 1850s, due to a drastic reduction in cattle production.²⁹

				Surface V	Vater Che	mistry ^b									
			xSC	D_4^{2-}			N	⊃ ₃ −	3 ⁻ A				ANC		
		MAG	MAGIC obsd MAGIC obsd		MA	GIC	ob	sd							
region	no. sites	Δ	σ	Δ	σ	Δ	σ	Δ	σ	Δ	σ	Δ	σ		
Czech Rep. (Slavkov F.)	2	-458	-10	-509	47	-7	-1	21	-1	80	6	194	88		
Czech Rep. (Bohemian F.)	3	-57, -7	70, -68	-44, -6	50, -81	-17, -	-16, -9	-8, -	5, 60	8, 1	15, 9	7, 8	, 5		
Finland	24	-29	16	-31	21	0	1	0	2	7	4	12	17		
Italy (lakes)	4	-10	-10	47	12	-1	-2	-1	-3	6	8	88	75		
		-17	-19	-16	-17	-2	-2	-7	-4	11	12	9	3		
Italy (rivers)	2	-26	-26	-14	-19	-3	3	-4	3	-3	-18	12	45		
Norway	31	-21	8	-26	12	-2	2	-6	5	19	7	26	10		
Scotland	42	-46	13	-52	20	2	5	-14	10	17	10	32	42		
Slovakia	30	-29	4	-21	11	-8	3	-9	7	13	5	35	18		
Sweden (N)	32	-43	26	-22	25	-1	1	0	3	11	6	22	37		
Sweden (S)	32	-103	41	-82	30	-2	2	2	3	26	13	13	50		
				Deposi	tion Cherr	nistry ^c									
					xSO ₄ ²⁻					,	TIN				
region		no. sites		EMEP		ob	sd	_	EME	Р		obsd			
Czech Rep. (Slavkov F.)		2	-	1.96 (71%)		-1.95	(74%)		-0.13 (10	5%)	-	-0.22 (19%	6)		
Czech Rep. (Bohemian F.)		3	_	0.83 (51%)		-1.38	(68%)		-0.26 (15	5%)		0 (0%))		
Finland		24	_	0.05 (13%)		-0.1	(36%)		-0.13 (41	1%)	_	-0.01 (5%))		
Italy (lakes, rivers)		6	-	0.62 (58%)		-1.05	(58%)		-0.22 (15	5%)	_	-0.24 (9%))		
Norway		31	_	0.23 (41%)		-0.09	(21%)		-0.04 (79	%)		-0.2 (25%	6)		
Scotland		42	_	0.28 (45%)		-0.8	(94%)		-0.24 (20	5%)	_	0.94 (88%	6)		
Slovakia		30	_	1.09 (40%)		-1.56	(54%)		-0.27 (24	4%)	_	0.44 (31%	6)		
Sweden (N)		32	-	0.07 (42%)		-0.1	(49%)		0.07 (-	30%)		0.01 (-59	%)		
Sweden (S)		32	-	0.32 (65%)		-0.24	(56%)		-0.16 (27	7%)		0.05 (-89	%)		

Table 2. Change in Simulated and Observed Surface Water and Deposition Chemistry between 1995 and 2009^a

^{*a*}Calculated as the average of values in 2008–2010 minus the average of values in 1994–1996, such that negative values indicate a decrease. $xSO_4^{2^-}$ is non-marine $SO_4^{2^-}$, TIN is total inorganic nitrogen, and ANC is acid neutralizing capacity. ^{*b*} Δ indicates regional mean, and σ is the standard deviation of values for individual sites around the regional mean. Units are μ equiv L⁻¹. ^{*c*}Units are g m⁻² yr⁻¹. Percentage reduction in simulated (CLE scenario) and observed deposition is shown in parentheses (negative values indicate an increase). Data from individual sites are reported for sites in Italy and the Czech Republic.

The results show that the actual decreases in deposition of xSO_4^{2-} over the period 1995 to 2010 was, for the regions together, about the same as those expected under the CLE scenario (Table 2). The correlation between the predicted and observed changes in xSO_4^{2-} was 0.92 (p < 0.001). However, for TIN, although the correlation between predicted and observed values in 2009 was 0.85 (p = 0.004), the correlation between the predicted and observed changes was only 0.42 (p = 0.257). There are several possible explanations for the differences between projected and observed deposition:

- Measurements at a single site do not (and cannot, except by chance) represent modeled deposition for a grid cell of 22,500 km².
- 2. Emissions of sulfur and nitrogen did not decrease as expected, or the decreases did not occur in the geographic locations (within a country) as expected.
- 3. The meteorological conditions in the years of interest (1995 and 2008–2010) differed from the meteorology used in the EMEP model, thus the deposition of sulfur and nitrogen was not distributed geographically as expected.
- 4. The EMEP model does not (and cannot) capture all the local (within-grid) variability of orography, land cover and meteorology and thus might give an inaccurate deposition at certain sites.

3.2. Surface Water Chemistry. For the period 1995–2009, large decreases of the concentrations of xSO_4^{2-} in surface waters

were forecast by MAGIC, and these forecasts agreed well with the actual measured concentrations (Figure 3a, Supporting Information Figures S2 and S3, Tables 2 and 3). However, although there were significant correlations between the observed and projected changes in concentrations, there were also significant differences in the mean values (Table 3).

Unlike xSO_4^{2-} , the observed NO_3^- trends in surface waters were highly variable with no evidence of a consistent Europewide trend from 1995 and 2009. This result complements recent European trend analysis as part of the ICP Waters program³⁰ as well as a previous European assessment of surface water $NO_3^$ trends.³¹ In some regions NO_3^- concentrations increased (Slavkov Forest and Bohemian Forest, Czech Republic), and in other regions no major changes were observed (Finland, northern Sweden), while concentrations decreased in Scotland (Galloway), Slovakia (Tatra Mountains), and Norway (Table 2, Figure 3d, Supporting Information Figures S4 and S5).

The simulated changes in concentrations of NO_3^- from 1995 to 2010 in general did not match the observed (Table 3). In most regions the correlation between the predicted and observed changes was not significant, and in some regions there was a significant difference between the mean predicted and observed changes. The simulations assumed that the fraction of incoming nitrogen retained in the terrestrial catchments remained constant from 1995 to 2010. As nitrogen deposition decreased over most of Europe during this period, the simulations forecast a proportional decline in NO_3^- concentrations in surface waters.



Figure 3. Left: Simulated versus mean observed surface water concentrations for the years 2008–2010 at each site. A range of years was chosen as not all sites had observations for all years of interest. Right: Change in simulated and observed surface water concentrations over the period 1995–2009. Sites within a region have the same symbol and color, while black lines show the 1:1 relationship. For delta change in xSO_4^{2-} , one point with a delta change of >400 μ equiv L⁻¹ in both simulated and observed was excluded for clarity. Note the log scale in the left-hand plots, and that gran alkalinity is presented instead of ANC at the Bohemian Forest sites (panel e and f).

In reality NO_3^- concentrations over the 15-year period in many cases did not follow the decline in nitrogen deposition. Of many possible explanations:

- Nitrogen saturation may have increased over the 15 years (lower fraction of N retained).^{32,33}
- 2. Forest damage from severe weather/disease/infestation (i.e., bark beetle).^{34,35}
- 3. Recovery of the forest may have promoted growth and uptake of nitrogen.³⁶
- 4. Warmer climate may have promoted uptake of nitrogen.³⁷

Observed surface water ANC mirrored the same general pattern of simulated ANC, with a universal tendency toward a rising ANC in surface waters from 1995 to 2009. The ANC at sites that have historically received high deposition inputs, and then experienced the most pronounced reduction in anthropogenic acidic deposition, recovered the most (Table 2, Figure3e, Supporting Information Figures S6 and S7). However, the magnitude of the rise in ANC was not so well predicted, with many regions not showing a significant correlation between the observed and projected changes, or showing a significant difference in the mean change (Table 3).

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			xS	:04 ²⁻			Z	0 ³⁻			A	NC	
		2	600		Þ	2	600		Þ	2(600		Δ
region	no. sites	r	diff	R	diff	r	diff	r	diff	r	diff	r	diff
Finland	24	0.96 (<0.001)	6.30(<0.001)	0.84 (< 0.001)	-2.02 (0.400)	0.81 (< 0.001)	-0.76 (0.03)	0.60 (0.002)	0.36 (0.175)	0.93 (<0.001)	10.22 (0.022)	-0.14 (0.523)	5.10 (0.172)
Norway	31	0.90 (<0.001)	-7.67 (<0.001)	0.95(<0.001)	-5.36 (<0.001)	0.90 (<0.001)	-3.61 (<0.001)	0.72 (<0.001)	-3.78 (<0.001)	0.88 (<0.001)	13.28 (<0.001)	0.36 (0.049)	6.79 (0.001)
Scotland	42	0.42 (0.006)	-4.03 (0.041)	0.72 (<0.001)	-6.49 (0.005)	0.54 (<0.001)	-16.89 (<0.001)	-0.001 (0.998)	-15.9 (<0.001)	0.92 (< 0.001)	$13.43 \\ (0.016)$	-0.09 (0.570)	15.74 (0.027)
Slovakia	30	0.90 (<0.001)	-1.47 (0.207)	-0.001 (0.994)	8.23 (<0.001)	0.90 (<0.001)	-3.90 (<0.001)	0.27 (0.158)	-1.90 (0.155)	0.99 (<0.001)	13.43 (<0.001)	0.08 (0.684)	22.6 (<0.001)
Sweden (N)	32	0.60 (<0.001)	2.12 (0.587)	0.68 (<0.001)	20.6 (<0.001)	0.61 (<0.001)	1.64 (<0.001)	-0.10 (0.582)	0.69 (0.212)	0.91 (< 0.001)	2.91 (0.789)	-0.30 (0.099)	10.67 (0.135)
Sweden (S)	32	0.78 (<0.001)	-0.20 (0.970)	0.56 (<0.001)	21.0 (0.002)	0.44 (0.012)	3.82 (<0.001)	-0.18 (0.332)	4.12 (<0.001)	0.96 (<0.001)	$8.10 \\ (0.443)$	-0.07 (0.722)	-12.56 (0.186)
all	202	0.89 (<0.001)	-0.89 (0.455)	0.89 (<0.001)	5.70 (<0.001)	0.73 (<0.001)	-3.53 (<0.001)	-0.10 (0.177)	-2.88 (<0.001)	0.96 (<0.001)	11.04 (<0.001)	0.12 (0.098)	9.36 (<0.001)
The correspon	ding p-ve	alues are indic	ated in parentl	heses. Regions	with fewer than	n five sites wer	e not analyzed	separately.					

Table 3. Correlation (r) between Predicted and Observed Values and Difference in Mean between Predicted and Observed Values (diff.) for Surface Water Chemistry in 2009 and

for Changes in Surface Water Chemistry between 1995 and 2009^a

We used an ANC threshold of 20 μ equiv L⁻¹ to indicate water quality sufficient to support viable populations of brown trout.³⁸ Jenkins et al.¹⁷ and Wright et al.³⁹ used ANC thresholds and MAGIC simulations to estimate the number of sites in three ecologically significant ANC categories in response to acid deposition across Europe for key years (1860, 1980, 2000, and 2016). Here we used a similar approach to compare the number of sites in the ANC categories predicted in 2009 (based on the mean data from 2008 to 2010) to those observed in 2009 (based on the mean data from 2008 to 2010), and assessed these against the situation in 1995 (mean 1994–1996) (Figure 4). The simulated and observed ANC in 2009 show very similar classifications into the three categories.

4. DISCUSSION

Good models are the foremost tools for projecting future changes; this is the case for making projections of future acidification of soils and waters given alternative possible scenarios for acid deposition. A continuing concern in using models either to summarize our current knowledge or to assist in making policy decisions is the level of confidence that can be placed in the model projections. The "verification" or "validation" of a mathematical model of a natural system is problematic because natural systems are never closed, model results are non-unique, and "truth" cannot be proved absolutely.⁴⁰ Model evaluation is, however, feasible when the model is tested against observations from a range of heterogeneous ecosystems at multiple sites, and confidence in the models is increased if it is found to produce satisfactory results.⁴¹ This was the premise of the current study.

The MAGIC model has been subjected to several types of evaluations during the 30 years since its launch in 1985:

- 1. Compare model hindcasts with independent historical data records of acid deposition and water chemistry, such as the study of Larssen,⁴² a comparison of MAGIC simulations with 30-years of observations from four small calibrated catchments in Norway.
- 2. Compare MAGIC hindcasts with other types of observed historical data, such as paleo-limnological data for diatoms.⁴³
- 3. Compare the results from large-scale whole ecosystem acidification experiments with MAGIC simulations.⁴⁴

To these we now add a fourth type of test: Use MAGIC to project future water chemistry, wait 15 years, and then test if the projections actually came true.

The prerequisite for this test is that the CLE deposition scenario for 2010 used in the MAGIC projections did indeed happen. For sulfur deposition this appears to be approximately the case, but not so for nitrogen deposition. Differences in simulated and observed deposition were attributed to the following factors: (a) Bulk deposition was monitored at all study sites except those in the Czech Republic (Bohemian Forest) and Finland, where only the wet component was recorded. (b) In central Europe (Czech Republic and Slovakia) and northern Italy, marine inputs in deposition are minor, therefore xSO_4^{2-} (non-marine sulfate) is approximately equal to SO_4^{2-} .

Fortunately most of the ANC changes in the sites studied here have been driven by changes in SO_4^{2-} , and heretofore nitrogen has played a lesser role. The MAGIC model performed particularly well at those sites where the long-term hydrochemical trends were driven primarily by sulfur deposition and terrestrial geochemical (abiotic) processes. For nitrogen, refine-



Figure 4. Pie charts summarizing the number of sites within three ecologically relevant ANC classes which correspond to the probability of viable populations of brown trout. Red: ANC < 0, barren of fish; yellow: ANC 0–20, sparse population; blue: ANC > 20, good population. Pies are annotated with the number of sites per region.

ment to the model structure, setup, and parameterization is required to more readily capture biological processes and especially those processes driven by climate.⁴⁵ More detail is given on the importance of abiotic and biotic processes at site level in the references supplied in Table 1.

Non-marine sulfur deposition was the principal cause of acidification of the majority of surface waters in this study.³⁹ Of the strong acid anions, concentrations of sulfate (SO_4^{2-}) were commonly 3–10 times higher than that of nitrate (NO_3^{-}) . Since the 1990s, due to effective abatement policies, it is clear that xSO_4^{2-} has lost its role as the dominant acidifying anion, and NO_3^{-} and reduced forms of nitrogen (TIN) deposition are becoming a greater concern for all countries except Slovakia (Figure S1).

Nonetheless, the strong declining trend in observed surface water xSO₄²⁻ was successfully simulated at the majority of sites throughout Europe (Figure S2 and S3), and this is attributed to the calibration of $SO_4^{2^{-2}}$ adsorption parameters based on input/ output budgets⁴⁶ and valid EMEP deposition forecasts. Slight discrepancies with the model performance were observed. For example, simulated xSO_4^{2-} was overpredicted as a consequence of the possible desorption of sulfur from soil; the mismatch between surface water xSO_4^{2-} concentrations in the Galloway region of Scotland was attributed to disturbance of the soil from intensive forest management during ground preparation, tree planting, and felling operations in catchments dominated by forestry; and the clear increasing SO_4^{2-} trend in the Italian lakes (Boden Inferiore and Superiore) can be linked to the high content of carbonate and SO₄²⁻ minerals in the bedrock. It is hypothesized that the increasing SO₄²⁻ trend in the Italian lakes results from enhanced mineral weathering induced by the direct and indirect effects of climate change.⁴⁷ Similarly, the long-term variability in ANC of the Italian rivers is mainly driven by weathering processes and factors influencing them (e.g., climate change driving less snow cover in the higher portions of the catchments and a greater export of base cations from weathering processes.47 Such climate-induced geochemical processes were not represented in the model.

In general, NO_x deposition has played a secondary role in the acidification of surface waters in semi-natural systems throughout Europe, although TIN (NOx + NHy) has become the dominant form of deposition for the majority of regions as xSO_4^{2-}

concentrations decrease (Figure S1). Most nitrogen deposition is retained in the terrestrial catchments at the majority of sites, and thus leaching of NO_3^- has played a lesser role in water acidification.^{48,49} Simulated changes in NO_3^- concentrations from 1995 to 2010 were poorly represented by the model. This was particularly evident in catchments where the nutrient cycle had been disrupted as a result of unforeseen environmental perturbations (extreme climatic conditions, disease or infestation).

Our study provides strong evidence that the MAGIC model is a robust management tool capable of forecasting changes in surface water chemistry, primarily driven by geochemical processes, in response to changes in acid deposition following the implementation of abatement technologies. This multi-site evaluation confirms the value of dynamic modeling studies for integrating and synthesizing scientific understanding of natural resources management and future policy development. The credible prediction of the future recovery trajectories of sensitive surface waters is a key element in political decisions regarding revisions to existing protocols and potential new protocols to the LRTAP Convention. However, despite a number of refinements, adjustments, and extensive testing of the MAGIC model prior to the RECOVER:2010 project, this evaluation has demonstrated a clear need to improve the representation of climate driven processes responsible for the simulation of nutrients in surface waters.

ASSOCIATED CONTENT

Supporting Information

Observed and simulated atmospheric deposition and water quality data from 10 regions in Europe. This material is available free of charge via the Internet at http://pubs.acs.org.

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Notes

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Environmental Science & Technology

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Environmental Science & Technology

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