



Landscape controls on riverine export of dissolved organic carbon from Great Britain

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Abstract The dissolved organic carbon (DOC) export from land to ocean via rivers is a significant term in the global C cycle, and has been modified in many areas by human activity. DOC exports from large global rivers are fairly well quantified, but those from smaller river systems, including those draining oceanic regions, are generally under-represented in

global syntheses. Given that these regions typically have high runoff and high peat cover, they may exert a disproportionate influence on the global land–ocean DOC export. Here we describe a comprehensive new assessment of the annual riverine DOC export to estuaries across the island of Great Britain (GB), which spans the latitude range 50–60° N with strong spatial gradients of topography, soils, rainfall, land use and population density. DOC yields (export per unit

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area) were positively related to and best predicted by rainfall, peat extent and forest cover, but relatively insensitive to population density or agricultural development. Based on an empirical relationship with land use and rainfall we estimate that the DOC export from the GB land area to the freshwater-seawater interface was 1.15 Tg C year⁻¹ in 2017. The average yield for GB rivers is 5.04 g C m⁻² year⁻¹, higher than most of the world's major rivers, including those of the humid tropics and Arctic, supporting the conclusion that under-representation of smaller river systems draining peat-rich areas could lead to under-estimation of the global land–ocean DOC export. The main anthropogenic factor influencing the spatial distribution of GB DOC exports appears to be upland conifer plantation forestry, which is estimated to have raised the overall DOC export by 0.168 Tg C year⁻¹. This is equivalent to 15% of the estimated current rate of net CO₂ uptake by British forests. With the UK and many other countries seeking to expand plantation forest cover for climate change mitigation, this ‘leak in the ecosystem’ should be incorporated in future assessments of the CO₂ sequestration potential of forest planting strategies.

Keywords Dissolved organic carbon · Great Britain · Rivers · DOC export · DOC yield · Terrigenous DOC

Introduction

The Intergovernmental Panel on Climate Change (IPCC) estimates that the global export flux of carbon (C) from the terrestrial biosphere to rivers is 1.7 Pg C

year⁻¹ (Ciais et al. 2013). This export, which comprises dissolved and particulate organic and inorganic carbon, is equal to the net pre-industrial uptake of atmospheric CO₂ by the terrestrial biosphere, and similar in magnitude to the present-day net uptake of atmospheric CO₂ by the oceans. Approximately half of this C was estimated by the IPCC to be either outgassed from freshwaters as CO₂ or buried in freshwater sediments, leaving an estimated 0.9 Pg C year⁻¹ to be exported to the ocean. Of this river-to-ocean C export, some is buried in marine sediments or outgassed, some enters the 700 Pg marine dissolved organic carbon (DOC) pool, and the remainder enters the 38,000 Pg oceanic dissolved inorganic carbon (DIC) pool (Ciais et al. 2013).

While there is considerable uncertainty over the size of these pools and exports, Drake et al. (2018) suggested that the river to ocean C flux, and thus the DOC component of this export, are relatively well quantified, with a low uncertainty. Over time the number of rivers used to estimate the land–ocean DOC export has gradually increased, from less than 40 to more than 250 (Cauwet 2002; Dai et al. 2012; Li et al. 2017; Ludwig et al. 1996; Meybeck 1982), but the export estimate has remained fairly stable at between 0.20 and 0.24 Pg C year⁻¹. To some extent, this could reflect common data sources, and a general focus on the larger river systems that generate the majority of global river discharge (Raymond and Spencer 2015). Taking a different approach of aggregating data by biome and predicting fluxes based on soil properties, Aitkenhead and McDowell (2000) used a dataset of 164 rivers to obtain a higher DOC export estimate of 0.36 Pg C year⁻¹. However, by including many small headwater catchments, they may have over-estimated the land–ocean export by not accounting for DOC removal processes within the freshwater drainage network. While the land–ocean DOC export does appear to be relatively well-constrained, the dominance of larger rivers in most calculations could introduce a negative bias if under-represented smaller river systems have higher average DOC yields (flux per unit area). This could indeed be the case because peatlands, which generate the highest DOC yields, often form in near-coastal areas and drain via smaller rivers; for example none of the thirty largest global rivers by flow analysed by Raymond and Spencer (2015) drain the comparatively peat-rich regions of Northwest Europe, the Hudson Bay Lowlands,

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Indonesia, or Patagonia. Moore et al. (2013) measured DOC yields from an Indonesian blackwater river around 30 times higher than the global large river mean calculated by Raymond and Spencer (2015), suggesting the potential for such areas to contribute significantly to global riverine DOC fluxes despite comparatively small river flows. There is, therefore, a need both for more comprehensive riverine flux data from different geographic regions, including peat-rich temperate and boreal regions, and for an improved understanding of the relationships between riverine C fluxes and catchment properties within these geographic regions.

Greater knowledge of the controls on riverine C exports is also important in the context of global environmental change; a large component of the dissolved organic and inorganic C export from soils to rivers is natural, and thus an intrinsic component of the Earth's C cycle. However, human activities such as agriculture, urbanisation and changes to drainage systems have increased the fluxes of both DIC (Raymond et al. 2008) and DOC (Moore et al. 2011), via organic matter oxidation and weathering. This weathering has re-introduced 'old' C previously isolated from the hydrological cycle into circulation (Butman et al. 2015). Regnier et al. (2013) estimate that human activities have led to an increase in C export from soils to rivers of up to 1 Pg C year^{-1} , of which approximately 80% is soil derived, and most is in organic forms, although they further suggest that around 90% of this increase is either outgassed or buried in sediments, with only a small change in C input to the ocean. On average, DOC makes up around 25–50% of riverine C inputs to the oceans, depending on geographic region (Ciais et al. 2008; Cole et al. 2007; Drake et al. 2018; Huang et al. 2012), and will be the focus of this work because it likely represents the most biogeochemically active component of the total export.

Previous studies have shown that the primary controls on spatial variation in the DOC export from soils to rivers include soil type and vegetation cover (Aitkenhead and McDowell 2000; Hope et al. 1997). Organic (peat) soils occupy around 3% of the land surface, yet contain one third to a half of all soil organic carbon (Nichols and Peteet 2019; Yu 2012) and generate the highest riverine DOC yields (i.e. export per unit area) (Aitkenhead and McDowell 2000). Agricultural soils, by contrast, occupy 33% of

the land surface and have varying, but typically much lower, levels of organic carbon (Scharlemann et al. 2014) and DOC export. The biochemical characteristics of organic matter exported from these ecosystems are fundamentally different. Peatlands produce high C:N, biologically refractory, photochemically reactive DOC, whereas agricultural land produces low C:N, biologically labile, photochemically resistant DOC (Berggren and del Giorgio 2015; Jones et al. 2016; Yates et al. 2016).

Great Britain (GB, comprising the countries of Scotland, England and Wales) is the world's 9th largest island, and forms a hydrologically discrete study unit of many small (by global standards) river systems which drain a highly diverse range of topography, soils and land-use. Together with a wealth of existing data, this makes it a good location to assess the large scale driving variables affecting organic matter fluxes in fluvial systems within the temperate zone. Great Britain also has a relatively large coverage of deep peat organic soils (12%), primarily blanket bog ecosystems, in the northern and western uplands of Scotland, Northern England and Wales (Evans et al. 2017a). There is a strong geographic gradient in soil C content, meteorology and land-use, with the lowland mineral soils of Southern and Eastern England largely converted to agricultural use (arable and improved grassland), and having a low C content. Overall, approximately 50% of the GB land surface is covered by arable and improved grassland (Rowland et al. 2017). We use data from a coordinated, GB-wide one-year sampling campaign aimed at estimating the total flux and composition of riverine DOC export from the GB land mass. For the purposes of this study (and in common with most previous studies of riverine DOC export) we defined the boundary for terrestrial to marine DOC export as the lower limit of freshwater; i.e. we did not account for DOC removal (or production) processes within the estuary, which will be considered in a follow-up paper (Garcia-Martin et al. in prep.). However, we did attempt to account for DOC export from unsampled catchments and land areas draining directly to estuaries. Our sampling programme directly measured export from a large proportion of the total GB land area (36%) and captured the entire range of soils and land-cover. To our knowledge, this represents the most comprehensive, coordinated survey of land–ocean DOC fluxes to have been undertaken in GB based on directly

measured DOC rather than absorbance based proxies. We report our analysis of the spatial controls on fluvial DOC yields and provide a new estimate of whole GB DOC export flux based on a catchment scale model using these variables.

Methods

River sampling

Forty rivers draining 36% of the GB land mass (Fig. 1) were sampled in the third week of each month during 2017. They were sampled close to the tidal limit, and where possible at long-term national hydrometric and water quality monitoring sites. Where existing discharge and water quality monitoring sites did not coincide, sampling was conducted at the long-term water quality monitoring sites unless it was unsafe to access this site. Water samples were filtered immediately through 0.45 µm cellulose acetate filters using rubber free syringes into HDPE bottles for DOC analysis and amber glass bottles for UV absorbance measurements. Samples were posted to the laboratory under cool conditions within 24 h of collection.

Sample analysis

A Shimadzu TOC-L analyser was used to measure DOC in filtered samples. Prior to analysis samples were acidified with 1 M HCl then purged with Zero grade air for 6 min to remove any inorganic carbon. The sample was then analysed for the remaining carbon, measured by combustion at 720 °C with a catalyst, which converts all carbon to carbon dioxide. The carbon dioxide is measured using an infra-red detector.

Specific UV absorbance at 254 nm ($SUVA_{254}$) was measured using a Cary Eclipse 60 UV–Vis spectrometer, a 1 cm quartz cuvette, and Milli-Q water as a baseline reference. All analysis was undertaken within 10 days of sampling and samples were refrigerated prior to analysis. $SUVA_{254}$ gives an indication of the aromaticity of the DOC pool (Weishaar et al. 2003), and hence an indication of DOC origin and reactivity. $SUVA_{254}$ is calculated as the absorbance (A) at 254 nm normalised to a 1 m path length (l) divided by the DOC concentration in $mg\ L^{-1}$ (Eq. 1) (e.g. Painter et al. 2018; Weishaar et al. 2003).

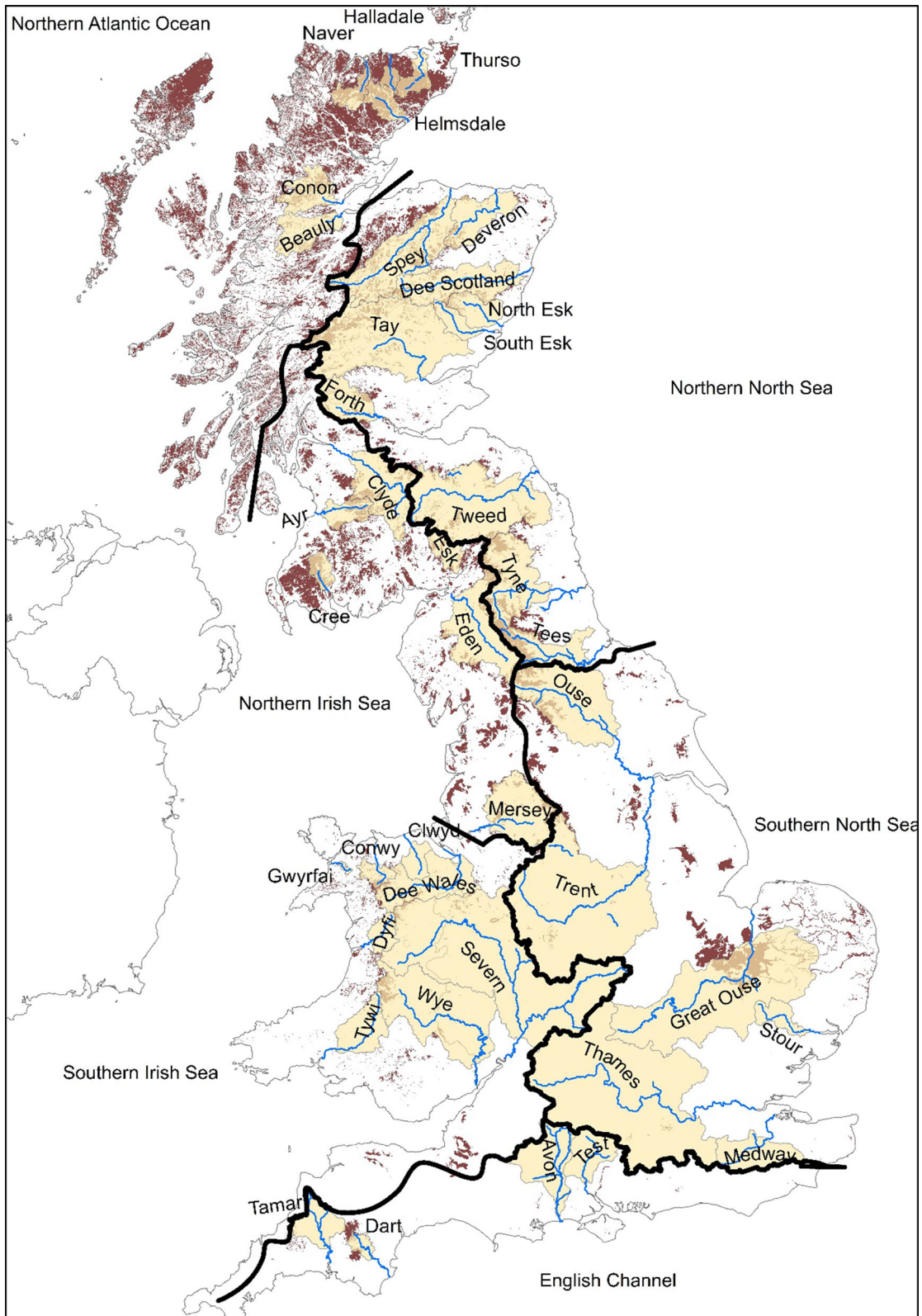
Fig. 1 location of catchment monitoring during 2017 showing surface water catchment boundaries for each sample point. Peat soils are shown in brown and the major watersheds determining flow into the different sea areas shown are represented by thick black lines

$$SUVA_{254} = \frac{A}{l \cdot DOC} \quad (1)$$

DOC flux calculation

Mean daily water flows from the 40 rivers monitored during 2017 were obtained from the national agencies for England, Scotland and Wales (Environment Agency (EA), Scottish Environmental Protection Agency (SEPA) and Natural Resources Wales (NRW), respectively). For three rivers (Mersey, Eden and Welsh Dee) co-located flow data were not available during 2017 so upstream discharge gauging data were used to estimate flows at the sample location. The relationship between upstream and downstream daily flows during 2015, the most recent year with comparable data, was calculated using regression analysis and daily flows for the sampling site for 2017 were estimated from the regression equation. Past annual discharge volumes were calculated for each comparison gauging station to ensure that total annual discharge was within 10% at each site, with a correction made to the annual discharge calculation for 2017 if differences between upstream and downstream gauging stations were greater than 10%. Flow data for 2017 were unavailable for the Beaulieu so DOC fluxes were calculated based on flows measured on the Conon, the adjacent river with similar catchment area, assuming the same mean areal runoff for both (topographically similar) catchments. Flow data for 2017 were unavailable for the Dyfi, so this was excluded from the DOC flux data analysis.

Annual DOC river fluxes were calculated using “method 5” of Littlewood et al. (1998), detailed in Eq. 2, where k specifies a conversion factor for the duration of sampling (in this case 1 year), C_i refers to the DOC concentration at sampling time i , Q_i refers to flow at sampling time i , Q_T refers to the mean flow over the whole sampling period, and n is the number of samples taken.



$$DOCflux = k \frac{\sum_{i=1}^n [C_i Q_i]}{\sum_{i=1}^n Q_i} Q_T \quad (2)$$

Other datasets used in the calculation

Fe additional datasets were used to support the spatial analysis of DOC fluxes from GB rivers. The CEH Wallingford Digital Terrain Model (Morris and Flavin 1990) was used to derive catchment boundaries and the mean altitude of the catchments. This dataset comprises a 50 m grid of elevation values with a vertical resolution of 0.1 m. Ordnance Survey spot heights and hydrologically accurate digitised river channels were used during the development of this dataset.

The Met Office Standardised Annual Average Rainfall data covering the period 1961–1990 (SAAR 1961–90) were used to characterise spatial variations in catchment rainfall. This dataset consists of a 1 km grid of interpolated rainfall values based on measured rainfall and terrain characteristics including: relative geographical position, the ratio of land to sea within 3.5 km, and elevation (Spackman 1993). This dataset provides consistent long-term average rainfall values across GB and was therefore considered a better basis for spatial analysis than local-scale or shorter-term monitoring.

The mean Base Flow Index (BFI) for each catchment was calculated from a 1 km grid of BFI across the UK. Theoretical BFI values range from 0–1 and provide an indication of the proportion of base flow contributing towards overall river flow, with higher values indicating a greater proportion of base flow (Gustard et al. 1992).

Land cover data were derived from the 2015 CEH Land Cover Map (LCM 2015) (Rowland et al. 2017) for all catchments, and compared to the GB land cover pattern. The land use data were derived two years prior to the water sampling taking place and it is assumed that only minor changes in land cover will have occurred in this period. The 21 broad habitat types within the LCM were grouped into larger, more internationally meaningful groupings for analysis to reduce the potential number of explanatory variables compared to the number of sampled rivers (Table 1). The selected catchments were a strong match to overall GB land cover (Fig. 2), with the major land cover classes being improved and neutral grassland (sampling catchments 30%, GB 29%) combined arable land (24% for both) and woodland (13% and

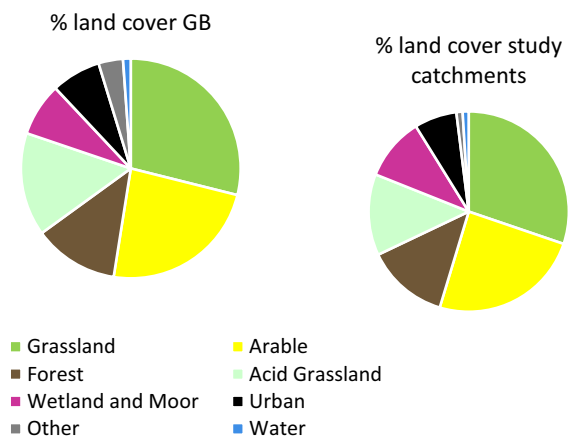


Fig. 2 Percent land cover in Great Britain (GB), as assessed by the Land Cover Map (LCM) 2015 and the percentage of land cover within all study catchments. Land cover types grouped as shown in Table 1

Table 1 Habitat groupings used for analysis of the effects of land cover on DOC concentrations and fluxes

| Grouped habitat type | Original Centre for Ecology & Hydrology Land Cover Map (LCM) 2015 broad habitat types included |
|----------------------|---|
| Arable | Arable and Horticulture |
| Forest | Conifer Woodland; Broadleaf Woodland |
| Wetland and Moor | Bog; Fen, Marsh and Swamp; Heather |
| Urban | Urban; Sub-urban |
| Acid Grassland | Acid Grassland; Heather Grassland |
| Grassland | Improved Grassland; Neutral Grassland; Calcareous Grassland |
| Water | Freshwater |
| Other | Inland Rock; Littoral Rock; Saltmarsh; Supralittoral Sediment; Supralittoral Rock; Saltwater; Littoral Sediment |

12% respectively). The study catchments had marginally lower cover of acid grassland compared to the GB total (13% versus 15%) and higher wetland and moor (10% versus 8%; note that this category includes semi-natural peatlands as well as wetland vegetation overlaying mineral and organo-mineral soils, see Table 1). ‘Other’ categories in this table include littoral and saltmarsh vegetation, which are under-represented in the study catchments due to the requirement to sample above the tidal limit (indeed, small areas of these categories in the sampling catchments may indicate classification errors in the LCM dataset). Urban areas are also slightly under-represented (6.8% versus 7.2%) because many larger cities (including London) are located along the tidal sections of major rivers.

Peat soil presence, as defined by an organic soil greater than 40 cm depth in England and Wales and 50 cm depth in Scotland, was derived from existing soil maps, habitat mapping and soil surveying and combined into the first UK wide peat soil map (Evans et al. 2017a).

Statistical analysis

Backwards stepwise multiple linear regression analysis was used to determine the combination of environmental variables that best explained spatial variation in annual DOC concentrations, annual DOC yield and mean annual $SUVA_{254}$. All possible combinations of terms were assessed using automated forwards stepwise regression and the effects of the order in which the explanatory variables were added within the regression analysis were tested to ensure that a priori assumptions about the likely drivers of the relationships did not unduly influence the outcome of the analyses. From these initial combinations highly correlated explanatory variables were assessed and only one was used in the final regression model. For example, wetland cover and peat soil cover positively correlated very strongly with each other, while arable land showed a strong negative correlation with rainfall. The initial automated regression analysis suggested that peat soil and rainfall were the variables that best explained DOC concentration and yield in each case so wetland cover and arable land cover were removed from the stepwise regression analysis. Where regressions gave a negative intercept this was set to

zero, to avoid physically impossible negative estimates of concentrations and fluxes in some locations.

The resulting statistical model was applied to the entire GB landmass to estimate the annual GB DOC yield at a 1 km² scale and the uncertainty associated with this value arising from the predictions intervals around the model coefficients for each parameter within the regression analysis was assessed using the “predict” function within the Stats package in R. The potential impact of forest and peat cover on DOC yields was estimated across a range of annual rainfall totals using the regression model described above. The current impact of forest cover on peat, and the potential for reducing DOC fluxes from afforested peatland soils, were assessed by comparing modelled DOC fluxes with and without forest cover on peat using ArcGIS v10.6. The DOC yield from peat soils with current land cover was calculated using the UK peat map developed by Evans et al. (2017a) to clip the GB modelled yield map in order to sum yields from cells containing peat. The potential reduction in yields that could be realised through removing forest from peat soils was estimated by recalculating emissions from the peat soil area with forest cover set to zero. This can be considered primarily an anthropogenic effect as the majority of forest cover on peat in GB is conifer plantation forestry. This assessment was carried out due to the current focus on peatland restoration by Governments and charities across GB. All analyses unless otherwise stated were carried out using R v 3.5.1 (R Core Team 2018).

Results

DOC concentrations

Mean annual flow weighted DOC concentrations ranged from 1.9 to 13.2 mg C L⁻¹, with the highest concentrations observed in rivers draining large upland catchments in Northern England and Scotland (Fig. 3). Over all sampled sites, the mean DOC flow weighted concentration was 7.8 mg L⁻¹, with a standard deviation of 3.0 mg L⁻¹.

Equation 3 shows the best (lowest AIC) statistical relationship between catchment characteristics and DOC concentrations. This explained 68% of the variability in the flow weighted mean annual DOC concentration and suggests that DOC concentrations

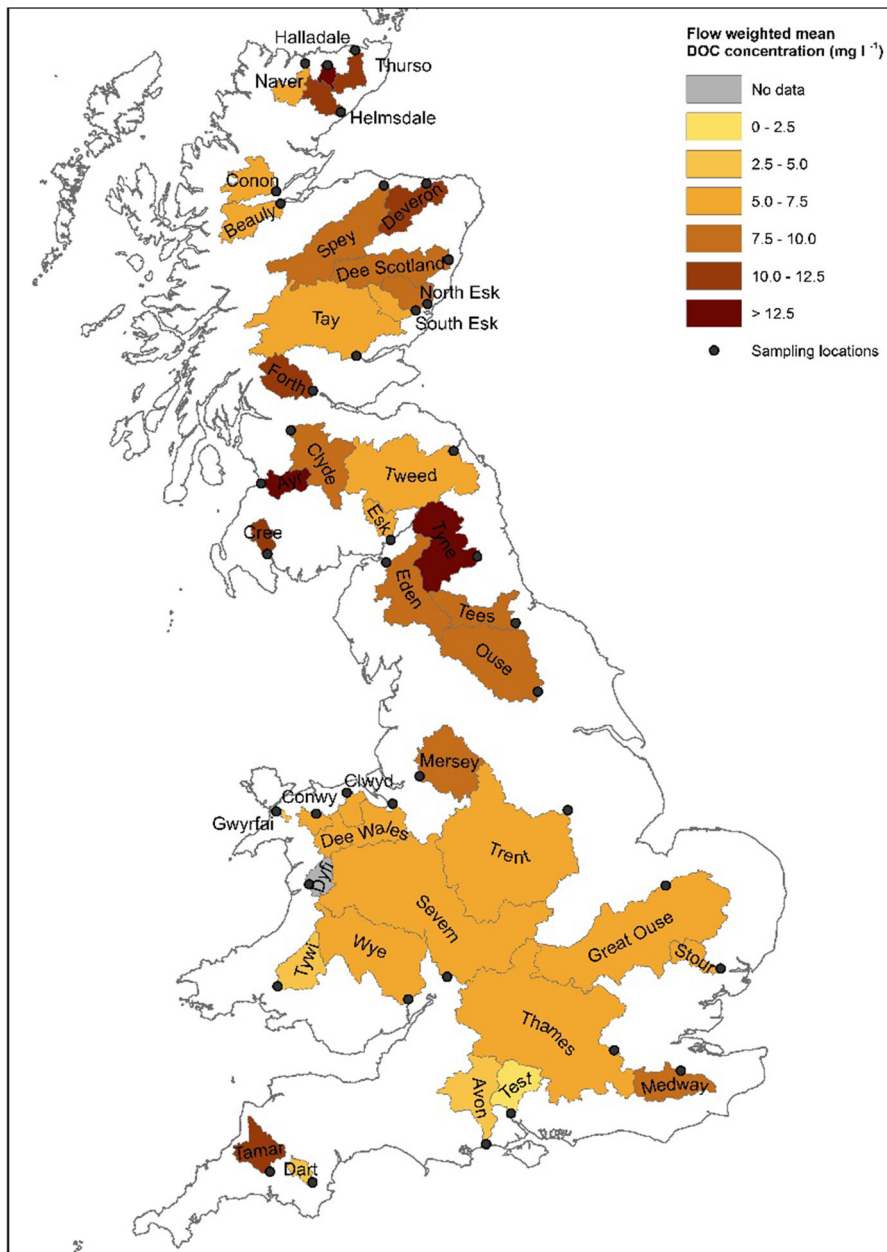


Fig. 3 Flow weighted mean dissolved organic carbon (DOC) concentrations determined during 2017. Outlines show the surface water catchments for each sampling location

tend to be larger in rivers draining catchments with high peat and grassland cover, a rapid hydrological response to rainfall, and high average elevation. The negative coefficient for rainfall implies that overall it exerts a diluting effect on DOC concentrations (Eq. 3).

$$\begin{aligned}
 [DOC] = & -0.004 * SAAR - 10.27 * BFI + 0.01 \\
 & * MeanAltitude + 0.09 * Peatsoils\% \\
 & + 0.06 * Grass\% + 12.03
 \end{aligned}
 \tag{3}$$

$N = 39$, $R^2 = 0.67$. SAAR = Standardised average rainfall 1961–1990, BFI = Base Flow Index, Mean

Altitude = catchment mean altitude, all other variables refer to the percentage cover within the catchment.

C export and yields

The total 2017 DOC export from the rivers sampled during this study was 290 Gg, with the largest DOC yields observed in the Ayr and Cree catchments in South-west Scotland (20.2 and 14.4 g C m⁻² year⁻¹ respectively), followed by the Halladale and Conon in Northern Scotland and the Conwy in North Wales (Fig. 4). The lowest DOC yields were from the Great Ouse in Eastern England (0.31 g C m⁻² year⁻¹), an area with low rainfall and heavily modified land usage. Equation 4 shows the best (lowest AIC) statistical relationship between catchment variables and DOC yield. This relationship explained 90% of the variability in DOC yield and suggests that this variability can be explained by rainfall, the percentage cover of peat soils and the percentage cover of forest within a catchment (Eq. 4).

$$\text{DOCyield} = 0.002 * \text{SAAR} + 0.096 * \text{Peatsoils}\% + 0.113 * \text{Forest}\% \quad (4)$$

N = 39, R² = 0.90. DOC yield (g C m⁻² year⁻¹), SAAR = Standardised average rainfall 1961–1990 (mm year⁻¹), all other variables refer to the percentage cover within the catchment.

Measured DOC yields, were separated into the Northern Atlantic (rivers draining into the sea on the north coast of Scotland), the northern and southern North Sea, the English Channel and the northern and southern Irish Sea, with the boundary defined by the Mersey estuary (See Fig. 1). Mean DOC yields were highest for rivers draining into the northern Irish Sea, at 11.2 g C m⁻² year⁻¹, followed by the North Atlantic at 10.1 g C m⁻² year⁻¹. Yields for rivers flowing into the northern North Sea and southern Irish Sea were similar, with means of 5.5 and 5.4 g C m⁻² year⁻¹ respectively, while yields for rivers draining to the English Channel and southern North Sea were lowest (3.6 and 1.3 g C m⁻² year⁻¹).

Equation 4 was used to estimate the DOC yields that would be delivered to the tidal limit from a hypothetical set of catchments comprising 100% peat soil cover, 100% forest cover and 100% forest cover

on peat soil, for a range of rainfall values (Table 2). The data suggest a ‘baseline’ DOC yield from (naturally unforested) peatlands of around 10 to 16 g C m⁻² year⁻¹. The presence of forest—which for most upland areas of Britain is dominated by planted non-native conifers rather than native broadleaf woodland—generally increases DOC yields. This is amplified where conifers are planted on peat (a process which generally also involves peat drainage), giving DOC yields that are approximately double those from unforested peatland at equivalent rainfall levels.

DOC composition

Mean annual SUVA₂₅₄ values were highest in the rivers draining Northern Scotland, Southwest Scotland and Northern England (Fig. 5). Annual rainfall and peat cover were again among the strongest predictors of SUVA₂₅₄, implying that the conditions that give rise to high DOC yields also generate more aromatic DOC; this is also apparent in a direct comparison of mean SUVA₂₅₄ and mean DOC yields across all sites (Fig. 6). Mean catchment altitude, as well as higher coverage of both acid and improved grassland, also positively influenced mean SUVA₂₅₄ (Eq. 5).

$$\text{SUVA} = -0.0007 * \text{SAAR} + 0.004 * \text{MeanAltitude} + 0.03 * \text{Peat}\% + 0.024 * \text{AcidGrassland}\% + 0.014 * \text{Grassland}\% + 2.23 \quad (5)$$

N = 40, R² = 0.79. Variables as described in Eq. 3.

GB-scale DOC export

Gridded DOC yields, based on Eq. 4, are shown in Fig. 7. Note that this extrapolation effectively predicts the source of observed DOC flux at the sampling points close to the tidal limit, and thus cannot strictly be considered a map of the DOC produced by each grid cell (i.e. if in-river DOC removal is occurring, ‘effective’ yields may be smaller than ‘true’ yields). Nevertheless, this analysis reveals some clear spatial patterns in the sources of DOC export from the GB land area, and also has the advantage that fluxes from areas outside the larger sampled drainage basins can be inferred. The highest DOC yields are associated with the afforested peatlands of Northern and South-west Scotland, and Northern England. The general

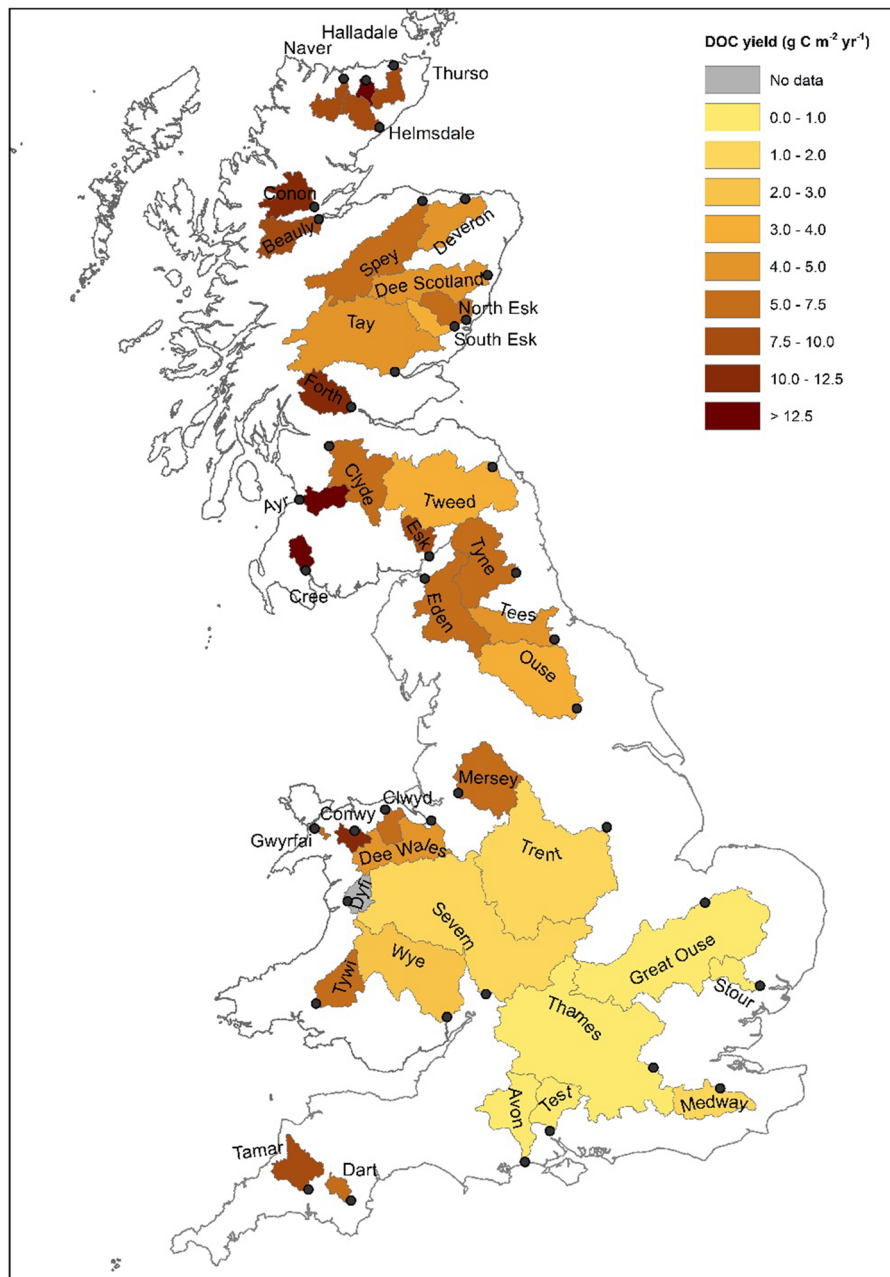


Fig. 4 Dissolved organic carbon (DOC) yields ($\text{g C m}^{-2} \text{ year}^{-1}$) determined during 2017. Outlines show the surface water catchments for each sampling location

increase in DOC yields from Southeast to Northwest reflects both the gradient in rainfall and the (linked) increase in peat cover along this gradient. Based on this extrapolation, total DOC export from the GB land mass in 2017 was estimated to be $1.15 \text{ Tg C year}^{-1}$, with a modelled uncertainty range from 0.96 to 1.35

Tg C year^{-1} . This gives a countrywide mean DOC yield of $5.04 \text{ g C m}^{-2} \text{ year}^{-1}$.

In terms of the destination of modelled DOC, export to the North Atlantic was highest at 0.21 Tg C , and lowest to the English Channel (0.07 Tg C during 2017). The Irish Sea received a total of 0.35 Tg of

Table 2 Modelled DOC yields for a hypothetical set of catchments with 100% peat cover, 100% forest cover and 100% forest on peat over a range of annual rainfall values (mm)

| Annual rainfall (mm) | Modelled DOC yield (g C m ⁻² year ⁻¹) | | |
|----------------------|--|-------------|---------------------|
| | 100% peat | 100% forest | 100% forest on peat |
| 500 | 10.6 | 12.3 | 21.9 |
| 1000 | 11.6 | 13.3 | 22.9 |
| 1500 | 12.6 | 14.3 | 23.9 |
| 2000 | 13.6 | 15.3 | 24.9 |
| 2500 | 14.6 | 16.3 | 25.9 |
| 3000 | 15.6 | 17.3 | 26.9 |

terrestrial DOC export (0.16 Tg to the southern area, 0.19 Tg to the northern area), and the North Sea received a similar total DOC export of 0.38 Tg split evenly between the northern and southern areas.

GB scale estimates suggest that forest planting (primarily conifer) may have raised the GB DOC export flux by 0.17 Tg DOC year⁻¹; with forests on peat accounting for 0.045 Tg of this.

Gridded predictions of SUVA₂₅₄ (Fig. 8) also show geographic variation, largely corresponding to variations in peat cover, but with a less pronounced influence of rainfall, such that high SUVA₂₅₄ values are also predicted for drier areas such as Eastern Scotland and the lowland (fen) peats of Eastern England.

Discussion

GB scale DOC export and uncertainties

This study estimates whole GB DOC export and yield based on a dedicated and standardised sampling and analytical programme. Previous syntheses of GB data (e.g. Hope et al. 1997; Worrall et al. 2012, 2018) have relied on data collected by regional agencies usually for a different original purpose, and do not always cover all regions of GB; for example Worrall et al. (2012) has very little data from the north of Scotland where high DOC export was predicted. This study also used directly measured DOC concentrations, rather than absorbance-based proxies such as those used by Worrall et al. (2012) and the consistent timing of sample collection across all sites minimised the influence of short-term meteorological variability on spatial patterns, permitting robust empirical relationships to be derived between DOC concentration, yield and quality, and a range of spatial predictor variables.

Application of these empirical relationships to gridded spatial data allowed us to make a comprehensive estimate of the total land–ocean DOC export from the British land area that incorporated unsampled catchments, and areas discharging directly to the coast, estuaries and tidal rivers.

Our estimated annual export of DOC from the British land mass in 2017 of 1.15 Tg C year⁻¹ lies at the upper end of previous estimates, which range from 0.69 Tg C year⁻¹ (Hope et al. 1997) and 0.91 Tg year⁻¹ (Worrall et al. 2012) to a one-year maximum flux of 1.3 Tg C year⁻¹ reported by Worrall et al. (2018) for 2005 (their long-term mean estimated flux was 0.86 Tg C year⁻¹). Based on this comparison, our data suggest that the riverine export of DOC from Great Britain may be higher than previously estimated. As previous studies (Worrall et al. 2012, 2018) have used absorbance data as a proxy for DOC concentration from a number of their sites they would not have detected non-coloured DOM (e.g. Pereira et al. 2014) so their values may have under-estimated non-coloured DOM exported from rivers, and hence under-estimated total DOC export.

While the best-fit DOC model explained 90% of the variation in the measured data, a number of uncertainties remain in our upscaled flux estimate. Our calculated range of 0.96–1.35 Tg C lost from the GB landscape per year includes uncertainty in the linear regression parameters—rainfall, peat and forest cover—but does not account for uncertainty in the categorisation of land cover at a 1 km² scale, the spatial mapping of peat soils across GB, the upscaling of the rainfall totals, or upscaling of monthly samples to annual fluxes. It is also possible that some additional export of DOC via groundwater flow directly to the sea is not accounted for, although given low groundwater DOC concentrations (typically between 1–3 mg l⁻¹) this may be a minor contribution at the GB scale,

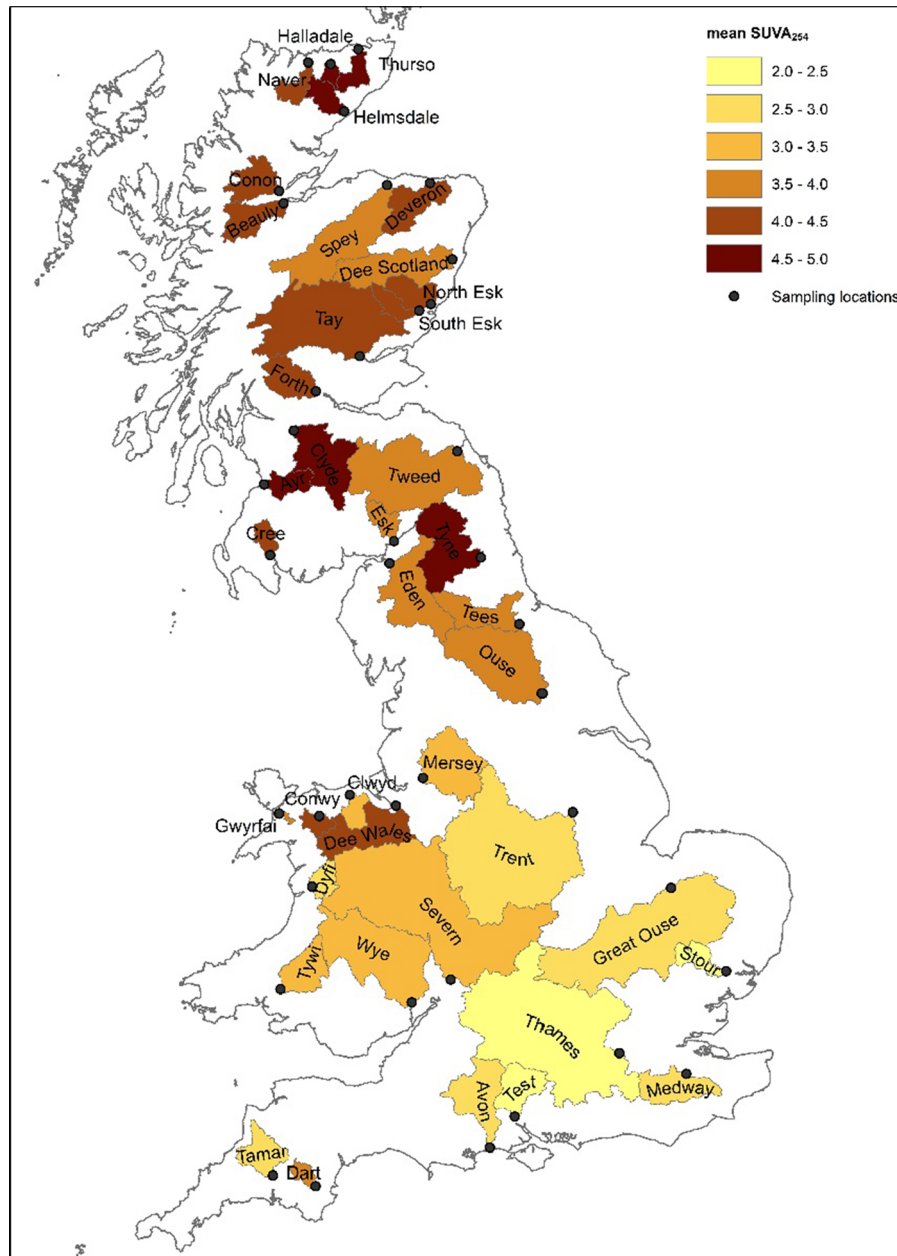


Fig. 5 Mean annual $SUVA_{254}$ (specific UV absorbance at 254 nm) determined during 2017. Outlines show the surface water catchments for each sampling location

depending on the volume of submarine groundwater discharge, which has not been quantified (Stuart and Lapworth 2016). With regard to long-term DOC fluxes, our estimate is based on a single year, which may not be typical of the longer-term conditions, especially given that both upland-derived and wastewater inputs of DOC have been changing during

recent decades (Monteith et al. 2007; Worrall et al. 2019). The potential inter-annual variability in the DOC flux is not covered in this work, with potential sources of variation arising from the water flux from the rivers and from changes in DOC concentration. Records from the National River Flow Archive (www.nrfa.ceh.ac.uk) show that river flows in 2017 were

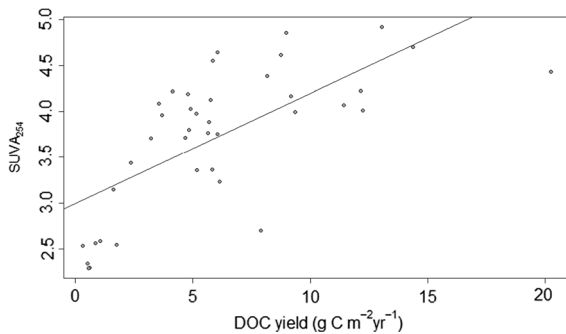


Fig. 6 Relationship between annual dissolved organic carbon (DOC) yield and SUVA₂₅₄ (specific UV absorbance at 254 nm). $R^2 = 0.46$, $P = 0.000001$

similar to the previous five years, suggesting that DOC exports calculated for 2017 are indicative of the short-term conditions across GB.

A further source of uncertainty in the regression model is that all peatland soils are treated as a homogenous entity, despite there being considerable variation in peat soil type (e.g. fen versus bog, upland versus lowland) and condition (drained, burned, near natural etc.), some of which have been suggested to influence DOC concentrations in waters draining peat soils (e.g. Evans et al. 2016; Yallop et al. 2010). At present, however, no sufficiently comprehensive national scale data are available that would permit this information to be used in the flux model. Future developments in remote sensing of peatland condition (e.g. Williamson et al. 2018) may allow for the future refinement of the present model. Nevertheless, the strong empirical relationships between our observed DOC fluxes and available spatial data permit us to draw some initial conclusions about the influence of land-use.

The influence of land-use

Our analysis of spatial controls on DOC concentrations, yields and quality all suggest a dominant influence of intrinsic catchment factors such as peat cover, rainfall and altitude. This is broadly in agreement with the main drivers found by Hope et al. (1997), who showed that rainfall and coverage of organic soils were the most important drivers affecting riverine DOC export, and with global-scale analyses such as that of Aitkenhead and McDowell (2000). We found little evidence that human activities in lowland

areas, such as urbanisation or arable and livestock farming, were having a strong effect on overall DOC export. This is somewhat in contrast to the findings of Worrall et al. (2012) and Worrall et al. (2018), who observed a strong influence of urban sources on DOC in lowland rivers, and with global analyses such as that of Butman et al. (2015) who identified a signal of agriculture and urbanisation on radiocarbon levels in DOC. However, the analyses of Worrall et al. (2012) also showed that the influence of urban areas has declined sharply since the implementation of the European Urban Wastewater Treatment Directive in the early 1990s, so it is possible that this signal may no longer be so strongly evident in our 2017 data. Conversely, there has been a strong trend towards increasing DOC concentrations in GB headwater catchments since at least the 1980s, in some cases by a factor of two, which has been attributed to an increase in the solubility of soil organic matter in response to large reductions in acid deposition (Evans et al. 2012; Monteith et al. 2007). This could have increased the dominance of the ‘upland’ signal in our dataset, although it contrasts with the findings of Worrall et al. (2018) that the GB DOC flux has declined since peaking in 2005. Their conclusion was that the ‘upland’ signal may have been masked by a combination of in-river processing and declining urban wastewater inputs. Elsewhere in Northern Europe, where similar increases in headwater DOM have occurred, there does appear to be evidence that increases in DOC production from organic-rich headwater catchments have propagated through to increased DOC export from rivers to estuaries (Kritzberg and Ekstrom 2012; Raike et al. 2016). While our one-year dataset does not provide new information on the long-term trajectory of DOC flux changes, the apparent dominance of upland DOC sources in our large-river dataset appears consistent with the evidence from other studies that changes in headwater DOC production are in most cases likely to translate into changes in DOC export at the large river scale.

The only land-use related factor found to affect DOC flux in our analysis was the presence of forests, which to a large extent in the British uplands comprise non-native conifer plantations. The presence of forestry appears to consistently enhance DOC export, and this effect is amplified where forests are planted on peat soils, which will have been drained prior to

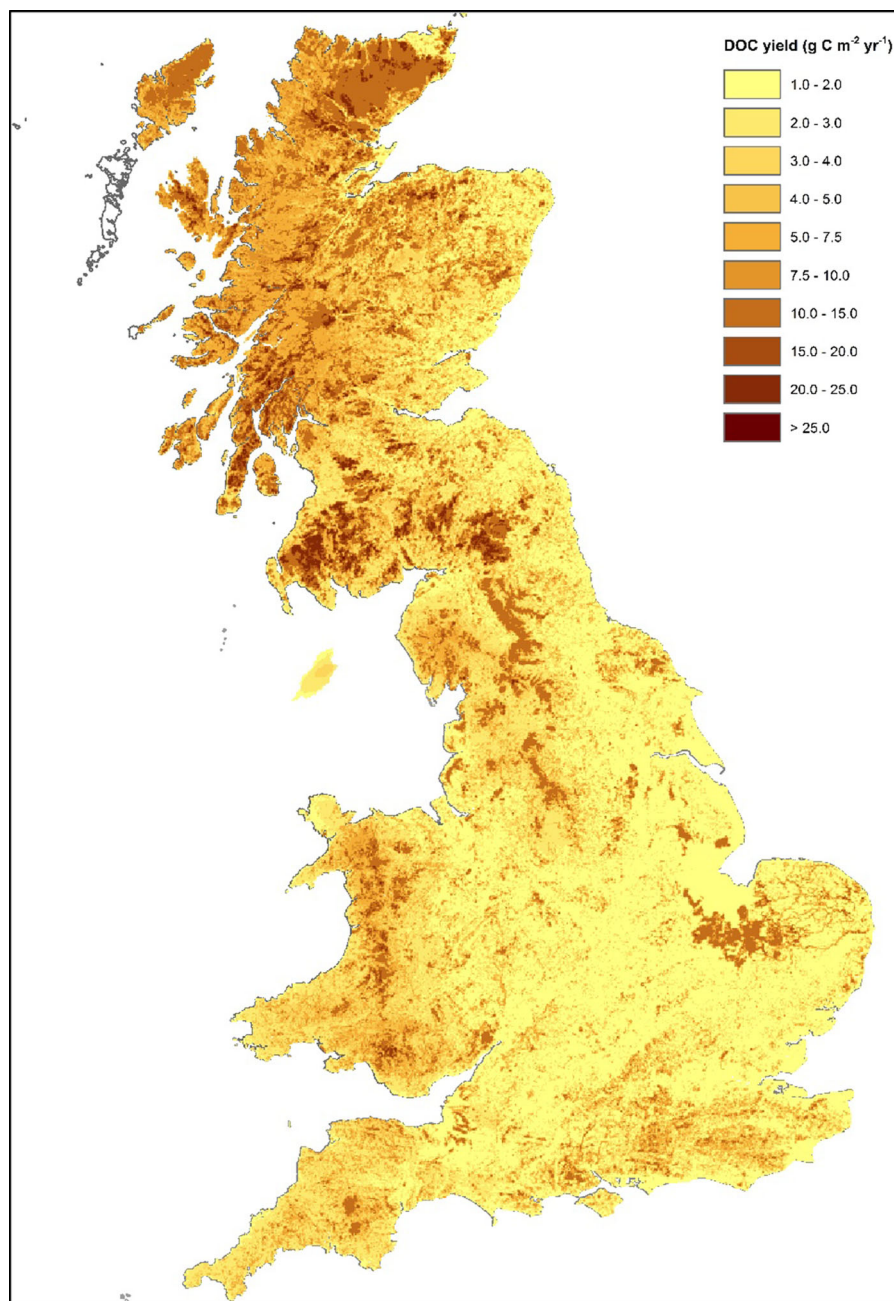


Fig. 7 modelled annual dissolved organic carbon (DOC) yields ($\text{g C m}^{-2} \text{ year}^{-1}$) at a 1 km grid scale across GB. Note that this extrapolation effectively predicts the source of observed DOC

flux at the sampling points close to the tidal limit, and thus cannot strictly be considered a map of the DOC produced by each grid cell

planting to lower the water table sufficiently to allow conifers to grow. This observation is consistent with previous work suggesting that drained and afforested peatlands tend to have elevated DOC export (Evans et al. 2016; Menberu et al. 2017; Skerlep et al. 2019)

and with a recent targeted study of forested versus unforested blanket bogs in Northern Scotland (Pickard et al. in prep.). The mapped spatial distribution of the DOC yields across GB reflects this land-use influence, with the highest yields observed from the afforested

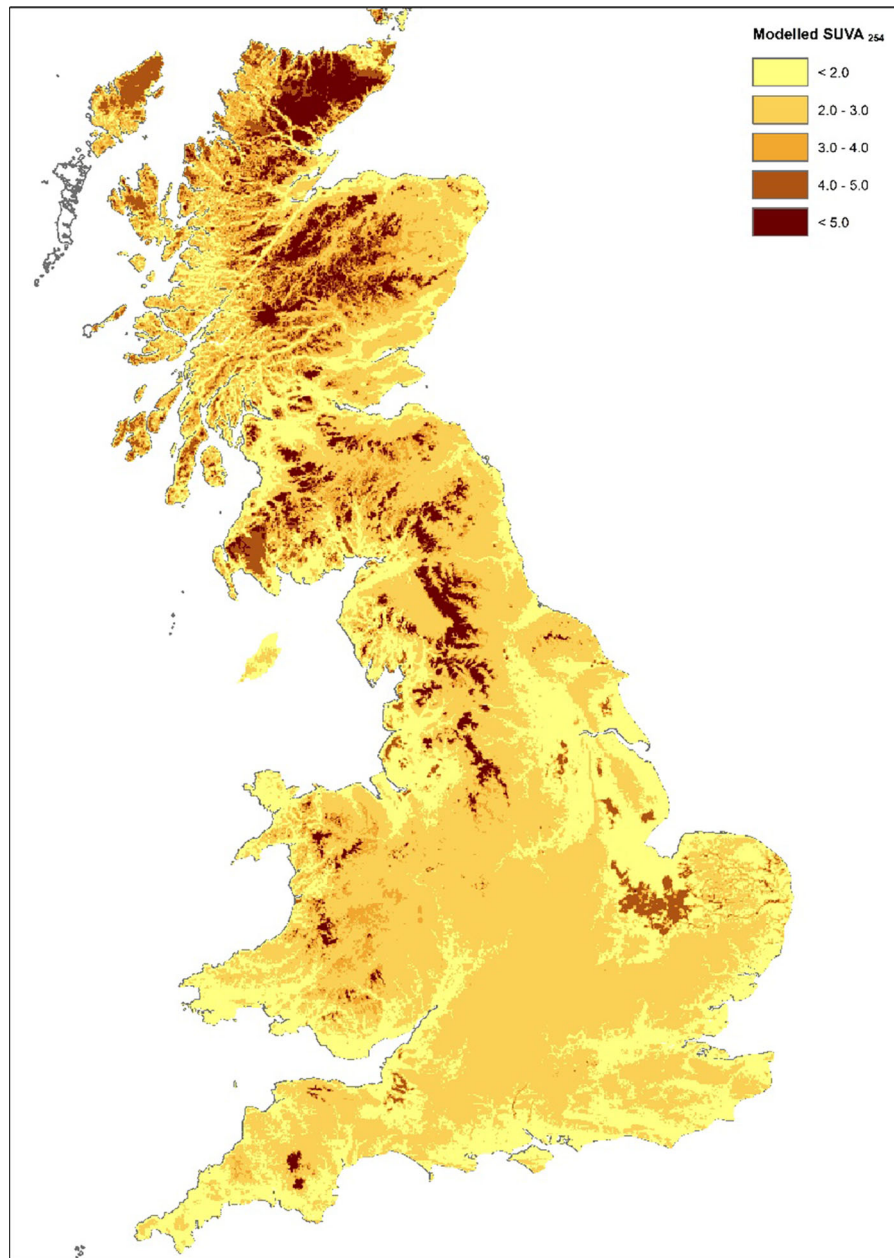


Fig. 8 Modelled $SUVA_{254}$ (specific UV absorbance at 254 nm) for Great Britain at a 1 km grid scale. Note, this is an extrapolation predicting the source of DOC with a given $SUVA_{254}$ value at the tidal limit, and is not strictly a map of $SUVA_{254}$ at each grid cell

peatlands of Southwest Scotland, Northern Scotland and Northern England. In total, we estimate the influence of conifer afforestation on DOC export at the GB scale to be up to $0.17 \text{ Tg C year}^{-1}$. Across GB there is a move towards peatland restoration, including the conversion of forestry plantation back to blanket bog, particularly in the Flow Country of northern

Scotland, where large areas of peatland have been impacted by conifer plantation. We estimate that across GB the presence of conifer on peat generates an additional $0.045 \text{ Tg C year}^{-1}$ in DOC export, a value which, although relatively small in overall terms, represents 4% of the DOC export from a land use covering 1.5% of the GB land mass. More broadly,

there is currently a strong policy drive to increase tree cover throughout all countries of the UK, as in many other countries, with the aim of sequestering CO₂ from the atmosphere in order to meet national targets for ‘net zero’ greenhouse gas emissions (Bastin et al. 2019; CCC 2020). Given that the UK has been heavily deforested since pre-history, the re-establishment of tree cover can hardly be considered an anthropogenic perturbation. On the other hand, forest expansion during the last century has largely involved the planting of exotic conifer species on organic-rich upland soils, rather than on the agriculturally productive lowland mineral soils that are more favourable to native broadleaf species. Our analysis suggests that the continuation of this policy could have implications for the magnitude of CO₂ uptake that can be achieved; the 0.17 Tg C year⁻¹ of forest-related DOC export from GB rivers equates to 15% of the estimated net C uptake by growing trees in the UK after accounting for re-emission via Harvested Wood Products (Brown et al. 2019).

The fate of DOC exported from GB rivers, and therefore their impact on greenhouse gas budgets, remains uncertain. Some DOC is likely to be mineralised to CO₂ and lost to the atmosphere in estuaries, coastal shelf seas or the deep ocean, but a proportion may be flocculated and buried in sediments, while a proportion of the mineralised DOC may enter the stable ocean DIC pool. Recent studies suggest that flocculation may be a relatively minor sink (Anderson et al. 2019) whereas biological and photochemical degradation of DOC in marine systems may take years to decades (Catalan et al. 2016), such that this removal is difficult to detect even in large-scale studies (e.g. Painter et al. 2018). As a ‘worst case’ scenario, assuming complete mineralisation of DOC exported from GB river systems and the subsequent degassing of CO₂ to the atmosphere, this would generate a maximum emission of 4.2 Tg CO₂ year⁻¹, with the ‘anthropogenic’ (i.e. forestry-related) component being 0.62 Tg CO₂ year⁻¹. Based on this assumption (and omitting any mineralisation of DOC in the drainage network above the sampling sites) CO₂ emissions associated with riverine DOC export would be equivalent to 1% of the UK’s total reported anthropogenic CO₂ emissions for 2017 (Brown et al. 2019). While some caution is required when directly comparing these values, our data clearly suggest that the land–ocean flux of C through British rivers is a

non-trivial component of the overall natural and anthropogenic C cycle. This finding supports other studies that have suggested significant anthropogenic enhancement of land–ocean C fluxes (e.g. Moore et al. 2011; Raymond et al. 2008; Regnier et al. 2013).

Spatial variations in DOM composition

A comparison of SUVA₂₅₄ values against the DOC yields from the monitored river catchments shows that, generally, the rivers with the highest DOC yields also tended to have the highest SUVA₂₅₄. High SUVA₂₅₄ is indicative of more aromatic organic compounds (Weishaar et al. 2003), which tend to be resistant to biodegradation, but more susceptible to photodegradation (e.g. Berggren et al. 2018; Cory et al. 2015; Koehler et al. 2016). In the GB rivers used in this study, SUVA₂₅₄ was primarily linked to peatland cover in the catchment, a finding also seen in rivers in North America (Hanley et al. 2013; Wollheim et al. 2015), the Arctic (O’Donnell et al. 2016) and Africa (Lambert et al. 2016, 2015). Despite its low biodegradability, several studies have shown that high-SUVA₂₅₄ DOM may be preferentially removed in both streams (Wollheim et al. 2015) and lakes (Kohler et al. 2013) due to its high photodegradability, and possibly also its greater susceptibility to flocculation and removal via sedimentation. It has been estimated that as much as 73% of high-SUVA₂₅₄ peat-derived DOM could be photodegraded in GB river systems within a 10 day period (Moody et al. 2013). Some previous studies of UK and Scandinavian catchments have suggested that as much as 70% of soil derived DOM can be removed prior to river water reaching the coast (Tranvik et al. 2009; Worrall et al. 2012). A global meta-analysis suggested a general reduction in SUVA₂₅₄ is seen in waters on a downstream pathway from wetlands, to rivers, to estuaries, to oceans, suggesting that aromatic photodegradable DOC is progressively removed from the system (Massicotte et al. 2017). The positive effect of mean altitude on SUVA₂₅₄ may be linked to the steepness of the catchment, with catchments with higher altitude being generally steeper in GB, and hence with faster water flows and shorter residence times meaning less opportunity for photodegradation of DOC. The positive influences of both acid grassland and improved grassland cover (which positively influences both DOC concentration and SUVA₂₅₄) are harder to

interpret. It is likely that within GB upland areas are dominated by soils with relatively high organic matter content and overlain by acid grassland; while it is possible that soil treatments such as liming may increase soil pH and hence humic DOC solubility (Evans et al. 2012), which would have the effect of increasing both DOC concentration and SUVA₂₅₄. These factors may be more specific to the GB land mass, while the effect of peat soils on SUVA₂₅₄ appears to be more universal.

Our data indicate that a significant proportion of high-SUVA₂₅₄ DOC remains at the river-estuary interface in many GB rivers. This persistence of photodegradable material through the freshwater system likely reflects the short transit time of water through many of the shorter British upland-dominated river systems, as well as the lack of large lakes or impoundments in the lower reaches of most of the sampled rivers. The limited depth of light penetration in high-DOM waters may also limit photodegradation rates (Berggren et al. 2018; Koehler et al. 2014). These factors will all tend to shift DOC degradation processes downstream to the coastal zone.

Rivers draining the lowland regions of Southern England had lower-SUVA₂₅₄ DOC, and are therefore more likely to be exporting proportionally more bioavailable DOC than photodegradable DOC to the estuarine zone. These rivers largely drain mineral soils used for agriculture, as well as urban areas, and therefore receive lower inputs of soil-derived DOC, but higher inputs of nutrients and potentially also wastewater and faecal derived DOC. The larger catchments, slower flows, and consequently longer residence times for water in lowland rivers are likely to favour photolysis of humic DOC. On the other hand, biological consumption of more labile catchment-derived DOM is likely to be offset by autochthonous DOC production under high nutrient conditions (Evans et al. 2017b; Graeber et al. 2015; Lambert et al. 2017). Together, these processes would have the effect of lowering the SUVA₂₅₄ values of river samples, while maintaining a modest export of DOC to the coastal zone.

Previous work has clearly shown that terrigenous DOC is present in shelf seas (Painter et al. 2018; Yamashita et al. 2011), and there is some evidence that recent increases in riverine DOC concentrations across Northern Europe (e.g. Kritzberg and Ekstrom 2012; Monteith et al. 2007) may have affected terrigenous

organic matter levels in the Baltic (Voss et al. 2011), although changes have not been detected (based on snapshot surveys rather than monitoring) in the North Sea (Painter et al. 2018). Painter et al. (2018) showed that the DOM reaching the coastal waters of the North Sea from the east coast of England and Scotland had lower-SUVA₂₅₄, and is therefore likely more bioavailable, than the GB average. This material may be turned over more rapidly, or less easily distinguished from DOM produced autochthonously within the marine system, than the high SUVA₂₅₄ DOM exported from the northern and western GB. Indeed, the high SUVA₂₅₄ values seen by Painter et al. (2018) around the north of Scotland may be linked to the outflows of the rivers draining the peat soils of this area, particularly in late summer when their sampling took place.

GB-scale DOC fluxes in a global context

Global estimates of DOC export from rivers to the ocean are in the region of 0.17–0.78 Pg C year⁻¹ (Dai et al. 2012), with more recent estimates appearing to converge towards the lower end of this range (Ciais et al. 2013; Li et al. 2017). The similarity in range and order of magnitude of the recent estimates is due in part to the constraint of global DOC flux models by river discharge, which is relatively well modelled (Dai et al. 2012). However Huang et al. (2012) have estimated that tropical rivers alone export 0.14 Pg C year⁻¹ as DOC, and Baum et al. (2007) calculated that Indonesia's rivers alone (which are omitted from most global analyses) could generate 0.02 Pg DOC annually, which is approximately 10% of global riverine DOC export. These observations, together with the more general under-representation of smaller peat-rich river catchments in global datasets discussed earlier, could indicate that the true global riverine DOC flux is somewhat higher.

Figure 9 shows estimates of DOC yields for the world's largest rivers by discharge (Raymond and Spencer 2015); from previous GB-scale flux assessments (Hope et al. 1997; Worrall and Burt 2007; Worrall et al. 2012) and from comparable national-scale estimates for Norway (De Wit et al. 2015), Finland (Raike et al. 2016), Indonesia (Baum et al. 2007) and the conterminous United States (Stets and Striegl 2012). As has already been noted, our estimates of DOC yields for GB are of a similar magnitude to, but somewhat higher than, previous estimates,

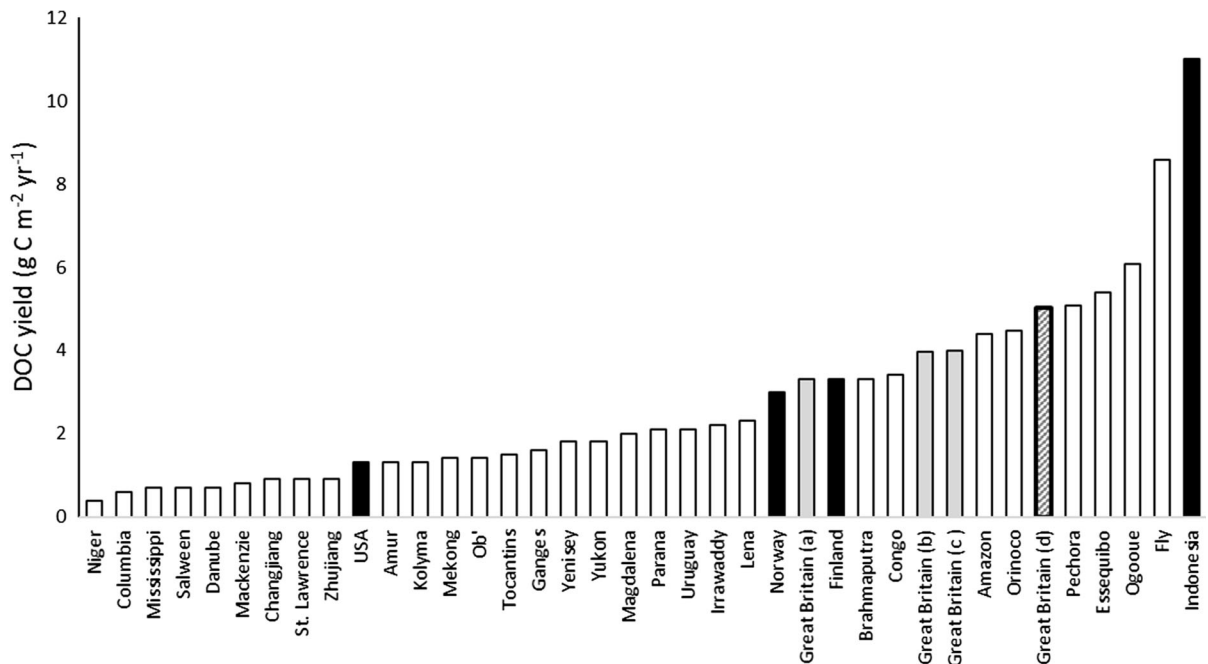


Fig. 9 Comparison of dissolved organic carbon (DOC) yield from major world rivers (white bars), available country scale estimates (black bars) and previous GB-scale studies (grey bars) and this study (bold outline and diagonal shading, denoted (d) on the x axis). All river data from Raymond and Spencer (2015),

country data from De Wit et al. (2015, Norway), Stets and Striegl (2012, USA), Raike et al. (2016, Finland), Baum et al. (2007, Indonesia), and Hope et al. (1997), Worrall and Burt (2007) and Worrall et al. (2012) (GB, denoted (a), (b) and (c) respectively on the x axis)

possibly due to our extrapolation from sampled larger rivers to unsampled smaller (and in some areas peat-rich) areas, or due to observed long-term increase in GB headwater DOC concentrations (Monteith et al. 2007) since the earlier studies were undertaken. Compared to the large river dataset of Raymond and Spencer (2015), DOC yields for GB rivers are similar to or higher than those observed for many of the great rivers of the humid tropics, including the Amazon and Congo. They are consistently higher than those of most large temperate river systems, and of most of the major Siberian and North American rivers draining to the Arctic Ocean. Compared to other national-scale estimates, estimated DOC yields for GB are higher than those for the conterminous US and Norway, similar to those from Finland, and lower than those for Indonesia. Our results are broadly consistent with the analysis of Li et al. (2017) who observed highest DOC yields in areas of high soil carbon content and high runoff, including many smaller drainage basins in Northern Europe, Eastern Canada and Southeast Asia.

Comparing our results to the analysis of Aitkenhead and McDowell (2000) our predicted DOC yields from

peatlands are similar to those of their UK peatland catchments, but higher than their boreal peatland sites, which were all located in Finland, an area of lower average runoff. In general, our estimated DOC yields from forested catchments were higher than the global mean for forests, which may reflect the managed nature of the landscape within many GB conifer plantations, and predominance of forestry on organic soils. The main drivers of rainfall, organic soil coverage and forest cover shown by this dataset have also been found to be important on a global scale, suggesting that these are globally relevant (Aitkenhead and McDowell 2000; Li et al. 2017).

The comparatively high DOC yields from British rivers compared to most continental-scale data (Fig. 9) likely reflect the higher proportion of peat soil coverage (12% versus a global mean of 3%) as well as the comparatively high rainfall. The relatively short residence time of DOC in the short rivers of the UK, and limited influence of lakes in many catchments, also likely constrains the potential for DOC to be removed through mineralisation or flocculation and

burial within drainage networks, when compared to many continental river systems.

Conclusions

The yield of DOC from British rivers is higher than the global mean, and higher than that of most large world rivers. To the extent that Great Britain can be considered representative of the relatively peat-rich, high-rainfall oceanic temperate zones of the Northern and Southern Hemisphere, our results suggest that the contribution of these areas to the global estimated land–ocean DOC flux may have been somewhat under-estimated. More generally, we argue that smaller river systems draining near-coastal peatland regions, including those of the humid tropics, may make a disproportionately large contribution to this flux, which risks being overlooked by global syntheses based on larger rivers.

Our estimated total riverine DOC export of 1.15 Tg C year⁻¹ from the GB land area appears to be largely natural, with spatial variations determined by intrinsic properties such as rainfall and peat cover. We did not find clear influence of agricultural or urban runoff on the total flux, although these cannot be ruled out, and they may also have affected DOM composition. On the other hand, our analysis does suggest a positive influence of forest cover on DOC export, equivalent to around 15% of the total flux, which we tentatively attribute to the effects of soil drainage following establishment of non-native conifer plantations on primarily upland soils. High-SUVA₂₅₄ DOM, which is characteristic of runoff from peatland areas and susceptible to photodegradation, reaches the estuaries of many upland-influenced British rivers, whereas low-SUVA₂₅₄, more biodegradable DOM is exported from the lowland rivers of Southern England. This contrasting composition of DOM exports from different regions may have implications for its fate and ecological impact within estuaries and shelf seas.

If all of the DOC exported from the GB land area were mineralised and degassed, this would generate a CO₂ emission of 4.20 Tg CO₂year⁻¹, equivalent to 1% of the UK's total current anthropogenic CO₂ emissions. The 'anthropogenic' forestry-related component of this flux is equivalent to 15% of current estimated net C uptake by growing trees in the UK. While some caution is required when directly comparing these values, our data clearly suggest that the

export of DOC through British rivers is a non-trivial component of the overall natural and anthropogenic C cycle, and may be considered a 'leak' in the terrestrial ecosystem. Overall, our results support the growing view that land–ocean C fluxes are an important and dynamic component of national and global C budgets, and a potential indirect pathway for anthropogenic CO₂ emissions. The fate of this terrestrial DOC in the marine systems remains a significant source of uncertainty in the global C cycle.

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Availability of data and material Data will be made available through the Environmental Information Data Centre at the end of the project.

Compliance with ethical standards

Conflict of interest The authors declare that they have no competing financial or non-financial interests.

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