Estimates of critical loads and exceedances of acidity and nutrient nitrogen for mineral soils in Canada for 2014–2016 average annual sulphur and nitrogen atmospheric deposition

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13 Abstract. The steady-state Simple Mass Balance model was applied to natural and semi-natural terrestrial 14 ecosystems across Canada to produce nation-wide critical loads of acidity (maximum sulphur, CLmaxS; maximum 15 nitrogen, CL_{max}N; minimum nitrogen, CL_{min}N) and nutrient nitrogen (CL_{mu}N) at 250 m resolution. Parameterization of the model for Canadian ecosystems was considered with attention to the selection of the chemical criterion for 16 17 damage at a site-specific resolution, with comparison between protection levels of 5% and 20% growth reduction 18 (approximating commonly chosen base-cation-to-aluminum ratios of 1 and 10 respectively). Other parameters 19 explored include modelled base cation deposition and site-specific nutrient and base cation uptake estimates based 20on North American tree chemistry data and tree species and biomass maps. Soil critical loads of nutrient nitrogen 21 were also mapped using the Simple Mass Balance model. Critical loads of acidity were estimated to be low (e.g., 22 below 500 eq⁻¹ ha yr⁻¹) for much of the country, particularly above 60°N latitude where base cation weathering rates 23 are low due to cold annual average temperature. Exceedances were mapped relative to annual sulphur and nitrogen 24 deposition averaged over 2014-2016. Results show that under a conservative estimate (5% protection level), 10% 25 of Canada's Protected and Conserved Areas in the study area experienced exceedance of some level of soil critical 26 load of acidity while 70% experienced exceedance of soil critical load of nutrient nitrogen.

27 **1 Introduction**

28 During the last three decades, reductions in sulphur (S) and nitrogen (N) emissions and acidic deposition have led to 29 improvements in ecosystem health across the U.S. and Canada; nonetheless, the acid rain question remains relevant 30 in Canada. Large point sources of emissions in western Canada have emerged, prompting concerns of impacts to 31 sensitive ecosystems in British Columbia and the Athabasca Oil Sands Region (AOSR) in northeastern Alberta (e.g., 32 Mongeon et al., 2010; Williston et al., 2016; Makar et al., 2018). Further, increased marine traffic in the Arctic due 33 to the effects of anthropogenic warming has raised questions about potential impacts of acidic deposition on 34 northern ecosystems already under pressure from climate change (Forsius et al., 2010; Liang and Aherne, 2019). Recovery of forest soils from decades of elevated acidic deposition in the northeastern U.S. and eastern Canada is 35

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encouraging, but is predicted to be slow (Lawrence et al., 2015; Hazlett et al., 2020) and is complicated by the effect
of elevated N deposition (Clark et al., 2013; Simkin et al., 2016; Pardo et al., 2019; Wilkins et al., 2023) and climate
change (Wu and Driscoll, 2010). The importance of N deposition to acidification and eutrophication has received
increased recognition in recent years, prompting new avenues of risk assessment and mapping (e.g. empirical critical
loads of nitrogen; (Bobbink et al., 2022; Bobbink and Hicks, 2014). While N oxide emissions in Canada declined
by 41% between 1990 and 2022, ammonia emissions increased by 24% in that same period (ECCC, 2024).

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43 The critical loads concept, defined as "the maximum deposition that will not cause chemical changes leading to 44 long-term harmful effects on ecosystem structure and function" (Nilsson and Grenfelt, 1988) is the primary tool for 45 identifying ecosystems that are sensitive to air pollution, particularly with respect to acidification and eutrophication 46 (De Vries et al., 2015; Burns et al., 2008). Ecosystems that receive-neidie- deposition above their critical load are 47 said to be in exceedance; that is, they are at risk of undergoing biological damage. Soil acidification is characterized 48 by attrition of base cations and a decrease in soil pH, which in turn causes leaching of toxic metals, such as 49 aluminum, and damage to plant roots. During the past three decades, these effects have been observed in forest soils in the northeastern U.S. and eastern Canada (e.g., Cronan and Schofield, 1990; Likens et al., 1996; Lawrence et al., 50 51 1999) that received acidic deposition in excess of their critical loads. The effects of nutrient N on ecosystems, 52 which include eutrophication, reduced plant biodiversity, and plant community changes, have also become an 53 emerging issue, with studies suggesting that some Canadian ecosystems are in exceedance of their nutrient N critical 54 load (e.g., Aherne and Posch, 2013; Reinds et al., 2015; Williston et al., 2016).

56 The standard approach for estimating soil critical loads is the Simple Mass Balance (SMB) model (Sverdrup and De 57 Vries, 1994, Posch et al., 2015), a steady-state soil chemistry model with several simplifying assumptions to reduce 58 input requirements. This approach has been used for regional and provincial critical load assessments in Canada (e.g., Ouimet et al., 2006; Aklilu et al., 2022) as well as on a multi-provincial (NEG-ECP, 2001; Carou et al., 2008; 59 Aherne and Posch, 2013) and national scale (Reinds et al., 2015). However, nationwide implementations of the 60 61 SMB model in Canada have been challenged by data paucity and disharmony-incompatibility across provinces (i.e. 62 different data sources, methodology and spatial alignment), coarse input map resolution, and computational difficulties driven by the size of the country and the subsequent size of data files used in critical load calculations. 63 In recent years, though, high-resolution input data (for soils, meteorology, and forest composition) have become 64 available and present an opportunity to refine, expand, and harmonise critical loads across the entire country, 65 66 including extending maps into the Canadian Arctic. These developments come at a time when policymakers in 67 Canada are seeking to define and track air quality impacts (such as those by acidic S and N deposition) on sensitive 68 ecosystems under the Addressing Air Pollution Horizontal Initiative (ECCC, 2021). Furthermore, development of 69 high-resolution critical loads of nutrient N to assess terrestrial eutrophication risk may contribute to efforts to meet 70 biodiversity goals such as those under the Kunming-Montreal Global Biodiversity Framework (ECCC, 2023c). While the SMB model is a well-established and widely used approach to determine critical loads, there remains a 71

72 need for harmonised application across Canadian ecosystems to provide maps from which the effects of S and N 73 deposition can be <u>estimated</u>assessed.

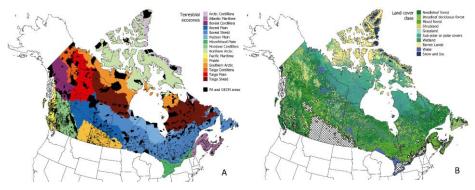
75 The objective of this study was to assess the impacts of acidic (S and N) and nutrient N deposition on terrestrial 76 ecosystems Canada-wide using the critical loads framework. In doing so, we applied a harmonised methodology to 77 the SMB model for Canadian ecosystems using high-resolution input maps, including modelled Canada-wide base 78 cation deposition (crucial for the estimation of critical loads). We also explored the choice of chemical (damage) 79 criterion criteria for Canadian ecosystems using a site-specific approach. Finally, we assessed the impact of 80 anthropogenic base cation deposition on exceedance estimates under annual average S and N deposition (ECCC, 81 2023a) for the three-year period 2014–2016, using the Canadian Protected and Conserved Areas Database (CPCAD; 82 ECCC, 2023b), to evaluate risk to sites that may be of interest to policymakers.

83 2 Methods

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84 2.1 Study area

85 As the second-largest country by landmass in the world at over 9.9 million km², Canada is home to a variety of 86 climates, soils, vegetation, and geological structures that are often_grouped into distinct ecozones which are often 87 used to generalise critical loads across similar ecosystems (Figure 1A). The full extent of Canada was included in 88 this study to bring together estimates for all 10 provinces and 3 territories. However, only natural and semi-natural 89 soils meeting certain criteria for critical load estimations were considered. A land cover map (CEC, 2018) was used 90 to exclude non-soil ecosystems including water, wetlands, and permanent snow and ice (see Figure 1B). Soils were 91 further limited to natural and semi-natural ecosystems by excluding urban areas, crop classes, and areas within the 92 boundaries of the agricultural ecumene (Figure 1B). Areas considered "barren" by land classification were not 93 excluded when mineral soil depth was indicated in the interest of including as much of the Arctic region as possible; 94 as the Arctic may be greening under global climate change (Myers-Smith et al., 2020) and northern shipping routes 95 become viable, the question of ecosystem health in this region becomes more material Areas considered "barren" by land classification were not excluded when soil depth was indicated. Since peat and wetland soil classification is 96 97 difficult at a Canada-wide scale (i.e., data at the required scale are presently unavailable), and given that the satellite 98 land cover map underestimates wetland cover (3.7% versus an expected 13% as given by the National Wetlands 99 Working Group; 1997), organic soils with 30% or more organic matter content were filtered out to close this 100 gapSince peat and wetland soil classification is difficult at a Canada wide scale (i.e. data at the required scale are presently unavailable), organic soils with 30% or more organic matter content were filtered out. The Hudson Plain 101 102 ecozone, which contains the world's largest contiguous wetland and is 80% wetland by cover (ECCC, 2016), was 103 also broadly excluded from the study because of low mineral soil presence The Hudson Plain ecozone (which 104 contains the world's largest contiguous wetland) was also broadly excluded from the study because of very low 105 mineral soil coverage.



106Figure 1: Study area illustrating the 15 terrestrial ecozones of Canada (A, data source: Agriculture and Agri-Food107Canada, 2013) with terrestrial Protected and Other Effective area-based Conservation Measures (OECM) areas in black108(ECCC, 2023b), as well as 15 (compressed to 9 for visualisation) land cover classes (B, data source: CEC, 2018) with109agricultural regions in crosshatch (Statistics Canada, 2017).

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111 2.2 The Simple Mass Balance model for acidity and nutrient nitrogen

112 Critical loads of acidity were estimated using the SMB model, which balances sources, sinks, and outflows of S and

113 N in terrestrial ecosystems while assuming ecosystems are at long-term equilibrium (i.e. about 100 years,

114 representing at least one forest rotation cycle) (CLRTAP, 2015). The SMB model defines the critical load of S and

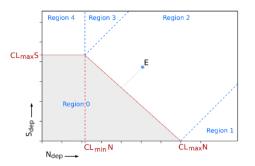
115 N acidity (Figure 2) as a function of the maximum S critical load (CL_{max} S), the maximum N critical load (CL_{max} N),

and the amount of N taken up by the ecosystem (*CL_{min}N*). Pairs of S and N deposition that fall outside this function

117 (white regionarea, Figure 2) signify that the receiving ecosystem is in exceedance of its critical load of acidity (i.e.,

118 it receives a potentially damaging amount of acidic deposition). Exceedance calculations are divided into four

119 regions to determine the shortest path to the critical load line along the function.



121Figure 2: The acidity critical load function (red line) is defined by the maximum sulphur critical load ($CL_{max}S$), the122maximum nitrogen critical load ($CL_{max}N$) and the minimum nitrogen critical load ($CL_{min}N$). Deposition points falling123outside the critical load function (e.g., point E) are in exceedance (and defined as (-Regions 1-4), while those within the124grey area (Region 0) are protected.

125 The determination of $CL_{max}S$ requires knowledge of non-sea salt base cation (calcium, magnesium, potassium, 126 sodium) deposition (BC_{dep}), soil base cation weathering (BC_{we}), chloride deposition (Cl_{dep}), base cation uptake 127 (Bc_{up}), and the critical leaching of Acid Neutralizing Capacity (the ability of the ecosystem to buffer incoming 128 acidity), denoted $ANC_{le,crit}$ (see Eq. 1). Note that sodium is included in some base cation terms (denoted BC, e.g., 129 BC_{we}) when sodium contributes to buffering, but where it concerns uptake by vegetation sodium is omitted since it is 130 non-essential to plants (denoted Bc, e.g., Bc_{up}).

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$$\begin{array}{ll} 132 & CL_{max}S = BC_{dep} + BC_{we} - Cl_{dep} - Bc_{up} - ANC_{le,crit} \\ 133 & (1) \end{array}$$

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135 The value of $ANC_{le,crit}$ (see Eq. (2)) is determined from a critical base-cation-to-aluminum ratio (Bc/Al_{crit}), which is 136 set to protect the chosen biota within ecosystems of interest (i.e., the critical chemical criterion), soil percolation or 137 runoff (Q), and the gibbsite equilibrium constant (K_{gibb} , see section 2.7).

$$139 \quad ANC_{le,crit} = -Q^{\frac{2}{3}} \cdot \left(1.5 \cdot \frac{Bc_{dep} + Bc_{we} - Bc_{up}}{K_{gibb} \cdot \frac{Bc}{Al}_{crit}}\right)^{\frac{1}{3}} - \left(1.5 \cdot \frac{Bc_{dep} + Bc_{we} - Bc_{up}}{\left(\frac{Bc}{Al}\right)_{crit}}\right)$$
(2)

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141 The calculation of $CL_{min}N$ from Eq. (3) describes the limit above which N deposition becomes acidifying, where N_{u} 142 denotes N taken up by vegetation and Ni denotes long-term net immobilization of N in the root zone of soils under 143 steady state conditions. A value of 35.7 eq ha⁻¹ yr⁻¹ (0.5 kg N ha⁻¹ yr⁻¹) was used, based on estimates of annual N_i 144 since the last glaciation by Rosen et al. (1992) and Johnson and Turner (2014) who recommended a range of 0.2 – 145 0.5 kg N ha⁻¹ yr⁻¹ and 0.5 - 1 kg N ha⁻¹ yr⁻¹ respectively; the midpoint (0.5 kg N ha⁻¹ yr⁻¹) was taken as a 146 compromiseA value of 35.714 eq ha⁺ yr⁺ (0.5 kg N ha⁺ yr⁺) was used, based on estimates of annual N; since the 147 last glaciation by Rosen et al. (1992). Lastly, $CL_{max}N$ is estimated from Eq. (4) using $CL_{max}S$, $CL_{min}N$, and the soil 148 denitrification (the loss of nitrate to nitrogen gas) factor (f_{de} , see section 2.10).

$$150 \quad CL_{min}N = N_i + N_u \qquad , \tag{3}$$

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$$CL_{max}N = CL_{min}N + \frac{CL_{max}S}{1-f_{de}}$$
 . (4)

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Equation (5) was used to estimate soil critical loads of nutrient N ($CL_{nut}N$), wherein the acceptable inorganic N leaching limit, a value set to prevent harmful effects of nutrient N such as eutrophication, vegetation community changes, nutrient imbalances, and plant sensitivity to stressors, is set from acceptable N concentrations in soil solution ($[N]_{acc}$) multiplied by Q (CLRTAP 2015). The $[N]_{acc}$ was set to 0.0142 eq m⁻³ (0.2 mg N l⁻¹ in soil solution) for conifer forests and 0.0214 eq m⁻³ (0.3 mg N l⁻¹) for all other semi-natural vegetation, following the generalised approach taken for the European critical loads database (Reinds et al., 2021) as values suggested in CLRTAP (2015)
are often country-specific and do not extend to other regions or ecosystems.

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162
$$CL_{nut}N = N_i + N_{up} + \frac{Q \cdot [N]_{acc}}{1 - f_{dr}}$$
 (5)

163 2.3 Data and mapping

164 Critical load estimates were calculated with the statistical programming language R version 4.1.0 (R Core Team, 165 2021) and the Terra package (Hijmans, 2022), wherein inputs (Table 1) to and outputs from the SMB model were 166 represented by 250 m resolution raster maps. Alignment and projection in the World Geodetic System (WGS84) followed the layers sourced from the OpenLandMap.org project (i.e., Hengl (2018c, a, d, b); Hengl and Wheeler 167 168 (2018) in Table 1), since they represented the majority of input (raster) data sources. Output maps were visualised using QGIS (QGIS Development Team, 2023) with accessible colour schemes (Tol, 2012). Acidity critical load 169 170 components (CLmaxS, CLmaxN, CLminN) and CLnutN were all mapped using equivalents of acidity (or nutrient nitrogen) per hectare per year (eq ha-1 yr-1). 171

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173 Table 1: Data sources for input parameters to the SMB model and critical load exceedance calculation.

Parameter	Units	Use	Original resolution	Source
Temperature				
Average annual air temperature (1981–2010)	°C	BC_{we}	250 m	McKenney et al., 2006
Soil				
Absolute depth to bedrock	cm	BC_{we}	250 m	Hengl, 2017
Organic carbon	imes 5 g kg ⁻¹	BC_{we}	250 m	Hengl & Wheeler, 2018
Sand fraction	%	BC_{we}	250 m	Hengl, 2018c
Clay fraction	%	BC_{we}	250 m	Hengl, 2018a
Bulk density	g/cm ³	BC_{we}	250 m	Hengl, 2018d
Coarse fragment volume	%	BC_{we}	250 m	Hengl, 2018b
Parent material acid class	class	BC_{we}	250 m	CLBBR, 1996; SLCWG 2010
Drainage class	class	BC_{we}	250 m	CLBBR, 1996; SLCWG 2010
Runoff (Q)	mm yr ⁻¹	ANC _{le,crit}	0.05° x 0.1°	Reinds et al., 2015
Vegetation				
Tree species composition	%	Bcup, Nup	250 m	Beaudoin et al., 2014
Biomass	Mg ha ⁻¹	Bcup, Nup	<u>250 m</u>	Beaudoin et al., 2014
Harvestable boundaries	km ²	Bcup, Nup	250 m	Dymond et al., 2010
Tree chemistry database (U.S.)	% Ca, Mg, K, N	Bcup, Nup	-	Pardo et al., 2005
Tree chemistry database (Can.)	% Ca, Mg, K, N	Bc_{up}, N_{up}	-	Paré et al., 2013
Land cover (2010)	class	Limiting extent	250 m	(CEC, 2018)

Agricultural ecumene (2016)	class	Limiting extent	5 km	Statistics Canada, 2017	
Ecozones	class Limiting extent, summary statistics		1:7.5 million	Agriculture and Agri- Food Canada, 2013	
Deposition					
Base cation deposition (2010, 2016)	eq ha-1 yr-1	ANC _{le,crit}	12 km	(Galmarini et al., 2021)	
Total mean S and N deposition (2014–2016)	eq ha-1 yr-1	Exceedance	10 km	(Moran et al., 2024b, a)	
Canadian Protected and Conserved Areas Database	class	Identifying areas of special interest	Various	(ECCC, 2023b)	

175 2.4 Base cation weathering

176 Generalised Base cation weathering BC_{we} (i.e., calcium, magnesium, potassium and sodium) was mapped using the 177 soil type-texture approximation method, which assigns a base cation weathering class (BC_{w0}) based on soil 178 characteristics (organic matter, sand, and clay percentage) and parent material acid class (see Eq. 6). A temperature 179 correction was applied to the BC_{we} as the speed of chemical weathering can be affected by temperature. Weathering 180 is modified by ambient temperature T, where A is the Arrhenius pre-exponential factor (3600 K), a temperature 181 coefficient for soil weathering (de Vries et al., 1992; CLRTAP, 2015). Note that average annual air temperature was 182 used to approximate annual average soil temperature in absence of a Canada-wide soil temperature map. To address 183 issues with resolution and continuity across provinces, high-resolution (global 250 m) predicted soil maps from the 184 OpenLandMap.org project were used for the following input variables: bulk density (p), organic carbon, coarse 185 fragment volume (CF), and sand and clay composition (see Table 1). One of the assumptions of the SMB model is 186 that the soil compartment is homogeneous; therefore, a weighted average for soil texture was developed based on 187 layer depth, total depth (D), and corrections based on coarse fragment volume, percent organic matter, and bulk density. Percent organic matter (OM) was obtained by dividing organic carbon $\frac{(in \times 5 \text{ g kg}^{+})}{1000 \text{ g}^{-1}}$ by 2 (as 188 189 recommended by Hengl & Wheeler, 2018; Pribyl, 2010).

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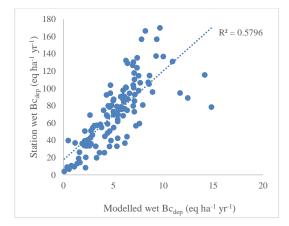
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$$BC_{we} = \left(\frac{\rho_{soll}}{\rho_{H_2O}}\right) D\left(1 - \frac{CF}{100}\right) \left(1 - \frac{OM}{100}\right) \left(BC_{w0} - 0.5\right) * 10^{\left(\frac{A}{281} - \frac{A}{273 + T}\right)}$$
(6)

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A second assumption is that the profile depth (*D*) is limited to the root zone, which was set to a maximum of 50 cm for forest soils and 30 cm for other land cover types such as shrubland, grassland and tundra. Soil depth was further limited by an absolute-depth-to-bedrock global modelled map (Hengl, 2017; Shangguan et al., 2017) in case bedrock was < 50 cm. Base cation weathering omitting sodium (Bc_{we}) required for the calculation of $ANC_{le,crit}$ (Eq. 2) was scaled by 0.8 after CLRTAP (2015).

198 2.5 Base cation deposition

199 In the absence of modelled Bedep-BCdep_data, previous Canadian mapping studies have employed a single value, or 200 coarsely interpolated from limited Canadian Air and Precipitation Monitoring Network (CAPMoN) stations from 201 1994-1998 (Aklilu et al., 2022; Carou et al., 2008; Ouimet et al., 2006). Critical loads estimates for Canada by 202 Reinds et al. (2015) used coarse modelled global Ca deposition (Tegen and Fung, 1995) based on soil Ca content 203 (Bouwman et al., 2002) and estimated the other ions by regression. To address the gaps in data availability and 204 spatial distribution, <u>Beder-BCder</u> in this study was sourced from modelled estimates produced with the Global 205 Environmental Multiscale-Modelling Air-quality and CHemistry (GEM-MACH) model at 12-km horizontal grid spacing for the air quality multi-model comparison project AQMEII4 (Galmarini et al., 2021). Two different GEM-206 207 MACH configurations, a version with detailed parameterizations and a second version with some simplified 208 parameterizations used for operational air-quality forecast simulations, estimated wet and dry non-sea-salt Beduep 209 BC_{dep} for North America. Gridded annual deposition fields for two periods, 2010 and 2016, were obtained. Ideally, 210 emissions data sources used for S and N deposition and <u>Bedep-BCdep.</u>would be the same; however, <u>Bedep-BCdep.</u>is often 211 not evaluated, and the version of the emissions inventories used for S and N deposition did not include <u>BedepBCdep</u>. 212 In the absence of a modelled Cl_{dep} map, and since the model estimates non-marine BC_{dep} , Cl_{dep} was assumed to equal 213 sodium deposition; BC_{dep} is therefore referred to as Bc_{dep} . Comparison of modelled wet Bc_{dep} to measured wet Bc_{dep} 214 data from 33 Canadian Air and Precipitation Monitoring Network (CAPMoN) precipitation-chemistry stations (Feng 215 et al., 2021) and 87 U.S. National Atmospheric Deposition Monitoring (NADP) precipitation-chemistry stations 216 (NADP, 2023) within 300 km of the Canada-U.S. border showed that modelled Bc_{dep} data were underestimated in 217 each model configuration and year by an average factor of 15, though the correlation was relatively high (Figure 3). 218 A Bcdep input map was prepared by averaging (wet plus dry) Bcdep across the two model runs and two years, scaling 219 up by 15 (after Figure 3), and resampling to the 250 m soil grid using bilinear interpolation. 220



221

222Figure 3: Modelled annual wet non-sea salt Bc_{dep} (Ca + Mg + K) versus measured annual Bc_{dep} at CAPMON and NADP223stations (NADP stations limited to those within 300 m of the Canada-U.S. border). Values are averaged across two years224(2010 and 2016) and two model configurations. Marine station sites were corrected for sea salt contributions.

225	The modelled Bc _{dep} and station observations include anthropogenic input, but the Bc _{dep} input to the SMB model is
226	meant to reflect long-term non-anthropogenic sources of base cations. However, large point sources of Bcdep (such as
227	surface mines) are a feature of some Canadian regions, and their impact should not be overlooked in critical load
228	assessments. The modelled Bedeep and station observations include anthropogenic input, but the Bedeep input to the
229	SMB model is meant to reflect long-term non-anthropogenic sources of base cations. However, large point sources
230	of Bedeep-such as the AOSR are a feature of some Canadian regions, and their impact should not be overlooked in
231	critical load assessments. Pollutant Bcdep from industrial sources can cause shifts in soil pH, plant community and
232	biodiversity, as well as direct damage to vegetation by dust (e.g. Mandre et al., 2008; Paal et al., 2013). To
233	demonstrate the relative impact of anthropogenic sources on Canadian critical loads estimates and to mitigate the
234	impact anthropogenic local Bcdep inputs have in remote regions, two scenarios were assessed, one including
235	anthropogenic Bcdep and another that attempted to smooth out anthropogenic "hot spots". To demonstrate the relative
236	impact of anthropogenic sources on Canadian critical loads estimates, two scenarios were assessed, one including
237	anthropogenic Bedep and another that attempted to smooth out anthropogenic "hot spots".
238	
239	To reduce the influence of anthropogenic point sources, a smoothing filter was applied using the SAGA GIS module
240	DTM Filter to identify local areas of locally intensified Bc_{dep} . Areas of Bc_{dep} above a 30% increase relative to a 20-

DTM Filter to identify local areas of locally intensified Bc_{dep} . Areas of Bc_{dep} above a 30% increase relative to a 20grid radius (approximately 50 km) were removed and infilled from their edges using inverse distance weighted interpolation. Note that forest fire emissions may be substantial and appear as Bc_{dep} hot spots; for this application of the SMB, we have not added a forest fire term to the base cation budget because of the difficulty of accounting forest fire loss over the entire country. The loss of nitrogen due to forest fires from forest biomass and organic soil content is also significant (and not reflected in N_{up} which only deals with loss from harvesting).

246 2.6 Soil runoff

247 Soil runoff was obtained from the hydrological model MetHyd (Bonten et al., 2016) following Reinds et al. (2015).

248 The data were resampled from the original resolution of 0.1 x 0.05° to 250 m and gaps were infilled from the edges.

A minimum Q was assigned (10 m³ ha⁻¹ yr⁻¹) for broad regions where the coarse input soil map (FAO-UNESCO,

250 2003) used for hydrological modelling did not identify soil (i.e., exposed bedrock), but the high-resolution soil depth

and texture maps used for critical loads did identify soil.

252 2.7 Gibbsite equilibrium constant

The gibbsite equilibrium constant (K_{gibb}) describes the relationship between free (or unbound) aluminum concentration and pH in the soil solution. As free aluminum concentrations are generally lower in the upper organic horizons, observed ranges based on the organic matter content of the soil may be used to assign a K_{gibb} value. Soils with organic matter less than 5% were assigned a value of 950 m⁶ eq⁻², soils with 5–15% organic matter were assigned a lower value of 300 m⁶ eq⁻² yr⁻¹, and soils ranging from 15–30% organic matter were assigned a value of 100 m⁶ eq⁻² (after CLRTAP, 2015).

259 **2.8 Chemical criterion for damage**

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260 The critical base-cation-to-aluminum ratio (Bc/Alcrit) is the most widely used threshold, indicating damage to root 261 biomass. It is a simple approach that has been used in past Canadian estimates (e.g., -Carou et al., 2008). In general, 262 it is applied as blanket or default value (e.g., Bc/Alcrit = 1) to a range of land cover types (e.g., forest or grassland). 263 In the current study, a species- and site-specific approach was used to assign damage thresholds for forest 264 ecosystems based on detailed tree species maps from the 2001 Canadian National Forest Inventory (NFI) (Beaudoin 265 et al., 2014). Two levels of protection were chosen to illustrate the difference between 20% acceptable growth 266 reduction (generally analogous to the default $Bc/Al_{crit} = 1$) versus a 5% growth reduction (generally analogous to 267 Bc/Al_{crit} = 10). Dose-response curves for Bc/Al_{crit} and root growth from Sverdrup and Warfvinge (1993) were 268 matched to species present in the NFI database (Table 2). If forest was present above 25% coverage, Values-values 269 were sorted by the most sensitive tree species (those with the lowest Bc/Alcrit) above 5% species composition and 270 given priority for the 250 m grid-cell value. If species-specific composition data for forests (from Beaudoin et al., 271 2014) were not available, the Bc/Alcrit value was averaged to the genus; if no genus-level data were available, an 272 average coniferous, deciduous, or mixed forest value was applied. For non-forested soils, a default value based on a 273 representative species for the land cover type was used (e.g., 4.5 and 0.8 for 5% and 20% protection levels, 274 respectively, for grassland based on the response of Deschampsia).

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 Table 2: Species-specific Bc/Alcrit values for 5% and 20% growth reduction scenarios-following Sverdrup & Warfvinge

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 (1993). Genus-level or generalised land cover values were derived from representative species.

	Bc/Alcrit (mol/mol)				
Category	5%	20%			
Species (forest)					

Abies balsamea	6.0	1.1
Fagus grandifolia	1.3	0.6
Picea mariana	2.5	0.8
Pseudotsuga menzerii	4.0	2.0
Pinus strobus	1.5	0.5
Picea engelmannii	2.5	0.5
Pinus banksiana	3.0	1.5
Acer saccharum	1.3	0.6
Alnus glutinosa	4.0	2.0
Quercus rubra	1.3	0.6
Pinus ponderosa	4.5	2.0
Pinus resinosa	4.5	2.0
Picea rubens	6.0	1.2
Picea sitchensis	2.5	0.4
Larix laricina	4.0	2.0
Populus tremuloides	4.0 8.0	4.0
Tsuga heterophylla	1.0	0.2
Thuja plicata	1.0	0.2
Betula papyrifera	4.0	2.0
Picea glauca	2.5	0.5
Betula alleghaniensis	4.0	2.0
Betula populifolia	4.0	2.0
Picea abies	6.0	1.2
Pinus sylvestris	3.0	1.2
1 mus sylvesins	5.0	1.2
Genus (forests)		
Abies	6.0	1.1
Acer	1.3	0.6
Alnus	4.0	2.0
Betula	4.0	2.0
Fagus	1.3	0.6
Larix	4.0	2.0
Picea	2.5	0.8
Pinus	3.0	1.5
Populus	8.0	4.0
Pseudotsuga	4.0	2.0
Quercus	1.3	0.6
Thuja	1.0	0.1
Tsuga	1.0	0.2
Generalised forest		
Deciduous	4.0	2.0
Coniferous	4.0 3.0	2.0
Mixed	3.0	1.2
Mixed	5.0	1.2
Generalised land covers		
Grassland	4.5	0.8
Grassland Scrubland	4.5 2.8	0.8 0.6

280 2.9 Base cation and nitrogen uptake

281 A species- and site-specific approach was also implemented to determine the net removal of nutrients (Ca, Mg, K,

282 N) through tree harvesting from forest ecosystems. Base cation uptake (Bc_{up}) and N uptake (N_{up}) were estimated for

²⁷⁹

283 forest soils by assuming stem-only removal; site-specific stand bark and trunk biomass estimates (Beaudoin et al., 284 2014) were multiplied by average trunk- and bark-specific nutrient and base cation concentration data from the tree chemistry databases for each species present. Two 'tree chemistry' databases were merged to include as many tree 285 286species as possible (U.S. data: Pardo et al., 2005; Canadian data: Paré et al., 2013); duplicate studies were removed 287 from the merged database and species data were averaged across studies. A simplifying assumption was made that 288 stand biomass was related to the species composition (i.e., the dominant tree species in a stand is also the dominant 289 contributor to biomass). The nutrient uptake maps were restricted to harvestable forest areas as delineated by 290 Dymond et al. (2010) and in all other regions it were was set to 0. Nutrient uptake of other land types (e.g., 291 grasslands) was considered negligible since grazing takes place primarily in agricultural regions, which have been 292 broadly masked out. Since Bcup cannot exceed inputs from deposition, weathering, and losses from leaching, a 293 scaling factor was used to constrain base cation uptake between its maximum (that is, deposition + weathering -

leaching) and a minimum calcium leaching value. The same scaling factor was applied to N_{up} .

295 2.10 Denitrification fraction

296 The soil denitrification fraction (f_{de}) is generally related to soil drainage (CLRTAP, 2015); classes ranging from 297 excessive to very poor drainage were assigned using the Canada-wide Canadian Soil Information Service (CanSIS) 298 databases v2.2 (CLBBR, 1996) and v.3.2 (SLCWG, 2010). Because the databases are not compatible in their 299 geographic extent and alignment, boundary and classification priority was given to the most recent database version 300 before rasterization. Differences in classifications and their alignment to the soil drainage classes from CLRTAP 301 (2015) are shown in Table 3. The soil denitrification fraction (f_{de}) is generally related to soil drainage (CLRTAP, 302 2015); classes ranging from excessive to very poor drainage were assigned using the Canada wide Canadian Soil 303 Information Service (CanSIS) databases v2.2 (CLBBR, 1996) and v.3.2 (SLCWG, 2010) (Table 3). In cases of 304 overlapping polygons from the two databases, boundary and classification priority was given to the most recent 305 database version before rasterization.

Table 3: Denitrification fraction (f_{de}) values (adapted from CLRTAP, 2015) and their corresponding drainage classifications in versions 2.2 and 3.2 of the Canadian Soil Information Service database.

Drainage	fde	V2.2	V3.2
Excessive	0	E/R	VR/R
Good	0.1	W	W
Moderate	0.2	М	MW
Imperfect	0.4	Ι	Ι
Poor	0.7	Р	Р
Very poor	0.8	v	VP

309

310 2.11 Deposition and exceedance

311 Exceedances for both acidity and nutrient nitrogen were calculated against-using total deposition maps of annual total S and N, which were sourced from GEM-MACH model output at 10 km horizontal grid spacing (GEM-MACH 312 313 v3.1.1.0, RAQDPS version 023) (Moran et al., 2024a, b). A three-year (2014-2016) annual average was taken to 314 reduce inter-annual variability in deposition, where input emissions based on annual emissions inventories specific 315 to each of these three years were used for the three annual runs. Note that Moran et al. (2024b) have presented 316 detailed evaluations of some components of these deposition estimates, specifically ambient concentration (as a 317 proxy for dry deposition) and wet deposition of SO₂ and particle sulphate (p-SO₄), HNO₃ and p-NO₃, and NH₃ and 318 p-NH₄, that suggest that they are robust.

319

320 Exceedances of critical load for both acidity and nutrient nitrogen (on a 250 m grid) were summarized to the 10 km 321 deposition grid using Average Accumulated Exceedance (AAE), which is an area-weighted average that considers 322 ecosystem coverage within each grid cell to derive the average of the summed exceedance; this addresses issues 323 with sparse coverage and considers all ecosystems within the grid (Posch et al., 1999). The Canadian Protected and 324 Conserved Areas Database (CPCAD) was used to identify areas in exceedance that may be of particular concern to 325 policymakers- (ECCC, 2023b). The database, assembled in support of Canada's reporting on Canadian 326 Environmental Sustainability Indicators and the UN Convention on Biological Diversity (among other initiatives), 327 identifies Protected Areas (PA) such as national and provincial parks as well as Other Effective area-based 328 Conservation Measures (OECM). Interim areas were included in expectation of their formal establishment. Areas 329 that fell entirely within the agricultural ecumene were removed, but areas that straddled the ecumene were retained. Areas were counted as in exceedance if any part of the area experienced exceedance at the 250 m resolution. 330

331

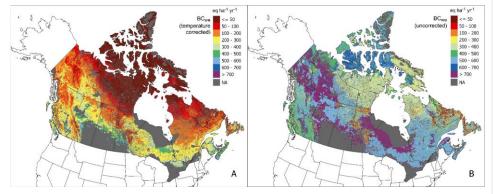
332 The exceedance calculations used for acidity employed the methodology described by Posch et al. (2015), where the 333 critical load function (Figure 2) was divided into five regions, and a different formula for exceedance was used for each region. Five inputs for each 250 m grid cell were required for these calculations: the S and N total deposition 334 335 pair plus CL_{max}S, CL_{min}N, and CL_{max}N values. For S and N total deposition pairs falling into four of the regions, the 336 exceedance value will be positive (i.e., in exceedance) and its magnitude indicates how great the S and N acidic 337 deposition at the location is above the critical load for acidity. For the Region 0, the exceedance value will be 338 negative (i.e., not in exceedance) and its magnitude will give how far the S and N acidic deposition is below the 339 critical load for acidity. Calculation of nutrient N exceedance was simply the difference between N_{dep} and $CL_{nut}N$.

340 3 Results

341 **3.1 Base cation weathering**

The estimated BC_{we} was very low (below 100 eq ha⁻¹ yr⁻¹) for nearly all regions north of 60°N latitude, and low (below 200 eq ha⁻¹ yr⁻¹) for many northern regions south of 60°N latitude (Figure 4A). Higher BC_{we} (above 500 eq ha⁻¹ yr⁻¹) was predicted for the calcareous and deep soils of the Prairies and southern Ontario adjacent to agricultural regions (i.e. the mean Prairie average for natural and semi-natural soils was 714 eq ha⁻¹ yr⁻¹), although most of these ecozones are excluded as part of the agricultural ecumene (Table 4). Average BC_{we} for the Arctic ecozones was < for q ha⁻¹ yr⁻¹, in contrast with $BC_{we} > 700$ for Mixed Wood Plain and Prairie ecozones. Similarly, provincial averages were lowest for Nunavut and highest for Saskatchewan (Table 4). Base cation weathering without temperature correction (Figure 4B, mean value of 570 eq ha⁻¹ yr⁻¹) illustrates the strong effect temperature has on limiting BC_{we} in most of the country (average 173 eq ha⁻¹ yr⁻¹), particularly Arctic and mountainous regions.

351



352

Figure 4: Base cation weathering rate (Ca+Mg+K+Na) with temperature correction (A) and without (B). The weathering rate was estimated using a soil texture approximation method with sand, clay, and parent material acid class modified by depth (see Section 2.4).

356 Table 4: Ecozone and provincial mean values for inputs and outputs of the Simple Mass Balance model, including base 357 cation weathering (BC_{we}) , smoothed base cation deposition (Bc_{dep}) , base cation uptake (Bc_{up}) , nitrogen uptake (N_{up}) , 358 critical base-cation-to-aluminum ratio (Bc/Alerit) forunder 5% and 20% growth reductions-scenarios, average sulphur deposition (DepS) and nitrogen deposition (DepN) 2014 - 2017), maximum critical load of sulphur (CL_{max}S), maximum 359 360 critical load of nitrogen (CLmaxN), minimum nitrogen critical load (CLminN) and critical load of nutrient nitrogen (CLmutN). 361 Units are in eq hai yr1 except for Bc/Alerit which is a unitless ratio. The critical loads presented in the table were 362 calculated using the 5% Bc/Al_{erit} and the smoothed Bc_{dep} . Note that values represent coverage averages over eligible soils 363 (e.g. excluding agricultural areas and organic soils).

Ecozone	BCwe	Bcdep	Bcup	Nup	Bc/Al _{crit} 5%	Bc/Al _{crit} 20%	DepS	DepN	CL _{max} S	CL _{max} N	CL _{min} N	CL _{nut} N
Arctic Cordillera	40	5	< 1	< 1	5.2	1.2	8	21	82	88	36	173
Atlantic Maritime	353	89	32	37	5.7	1.1	57	240	615	551	36	234
Boreal Cordillera	174	19	5	5	3.9	1.2	10	29	290	274	36	77
Boreal Plain	331	139	27	23	3.7	1.4	38	172	802	549	36	71
Boreal Shield	229	84	18	23	4.0	0.9	53	206	512	422	36	147
Hudson Plain	212	56	<-1	<1	2.8	0.8	30	444	4 99	221	36	10 4
Mixedwood Plain	712	180	< 1	< 1	3.6	0.9	137	712	1586	1171	36	145
Montane Cordillera	240	52	39	42	3.6	1.2	25	98	447	473	40	164
Northern	32	7	< 1	< 1	5.6	1.3	9	20	63	75	41	75

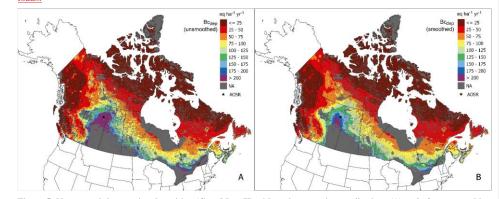
Arctic												
Pacific Maritime	274	25	78	135	2.9	0.9	53	172	608	1281	48	513
Prairie	559	191	13	2	5.0	1.9	54	423	1078	893	59	63
Southern Arctic	45	21	< 1	< 1	5.6	1.3	10	26	112	118	60	65
Taiga Cordillera	106	31	< 1	< 1	4.3	1.0	10	26	218	194	76	66
Taiga Plain	195	51	4	4	3.2	1.0	13	37	390	246	79	51
Taiga Shield	88	40	< 1	< 1	3.5	0.8	18	54	227	200	192	110
Province												
Alberta	285	133	24	17	3.7	1.4	35	142	730	512	58	78
British Columbia	235	37	40	53	3.6	1.2	26	92	439	551	91	206
Manitoba	217	86	7	7	2.9	0.9	41	146	512	338	44	66
New Brunswick Newfoundl	344	91	34	41	5.8	1.1	49	227	595	502	79	243
and & Labrador	110	24	6	7	4.6	0.9	24	71	217	190	43	223
Nova Scotia	422	92	21	28	5.6	1.1	68	249	733	652	65	261
Northwest Territories	114	41	< 1	< 1	4.0	1.0	11	28	254	191	36	49
Nunavut	34	11	< 1	< 1	5.5	1.2	9	22	75	87	36	75
Ontario	306	103	23	19	3.8	0.9	61	289	666	509	66	141
Prince Edward Island	422	69	19	18	5.3	1.0	57	209	672	558	66	226
Québec	148	46	11	14	4.5	1.0	38	132	314	299	50	153
Saskatchew an	230	124	12	8	3.1	1.0	29	128	607	492	49	62
Yukon	148	25	< 1	< 1	3.8	1.0	10	26	266	233	36	54
Canada	132	52	8.2	10	4.5	1.1	76	22	291	258	48	99

364

365 3.2 Base cation deposition

366 Modelled $B_{C_{dep}}$ ranged from low (< 25 eq ha⁻¹ yr⁻¹) in the north to higher values (> 200 eq ha⁻¹ yr⁻¹) around the 367 Prairies and the southern regions of the eastern provinces (Figure 5) as well as in Alberta and Saskatchewan (Table 4). Average (smoothed) Bc_{dep} was roughly one-third of BC_{we} . Hot spots of $\frac{BC_{dep}}{Bc_{dep}}$ associated with at 368 369 anthropogenic point sources (e.g., from mining operations as well as the contribution from the AOSR) were clearly 370 visible in the unsmoothed map (Figure 5A). The smoothing algorithm (Figure 5B) eliminated most of the effects of 371 point sources, at the cost of some loss of definition lowering average Bcdep (Canada-wide average of 52-68 eq ha-1 yr-372 ¹ pre-smoothing and <u>68–52</u> eq ha⁻¹ yr⁻¹ post-smoothing). However, it did not completely erase elevated Bc_{dep} in the AOSR; the difference in size between other point source footprints and the AOSR neccessitated a compromise in

374 filter radius and slope selection. The smoothed Bc_{dep} was adopted as the primary data set for presenting the critical 375 loads.



376

 377
 Figure 5: Non-sea-salt base cation deposition (Ca + Mg + K) with anthropogenic contributions (A) and after a smoothing

 378
 filter was applied to reduce the effect of anthropogenic point sources (B). The location of the city of Fort McMurray

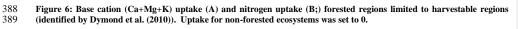
 379
 within The the Athabasca Oil Sands Region (AOSR) is identified by a star.

380 3.3 Base cation and nitrogen uptake

Base cation uptake ranged from < 1 to 545 eq ha⁻¹ yr⁻¹ and was highest in coastal British Columbia; the Pacific Maritime ecozone had the highest mean Bc_{up} at 79 eq ha⁻¹ yr⁻¹ (Table 4). Nitrogen uptake was also high in British Columbia and the Pacific Maritime zone (mean N_{up} of 135 eq ha⁻¹ yr⁻¹) as well as the Montane Cordillera (mean N_{up} of 42 eq ha⁻¹ yr⁻¹). Regions of elevated N_{up} were seen in eastern Ontario and southern Quebec (Figure 6); these occur on the Boreal Shield ecozone, which is a large ecozone that extends across multiple provinces over which N_{up} varies (but with a mean value of 23 eq ha⁻¹ yr⁻¹).

140

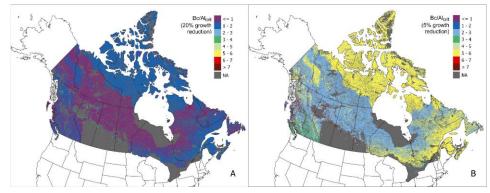




B

390 3.4 Critical base-cation-to-aluminum ratio

Almost the entire country fell below a *Bc/Al_{crit}* ratio of 2 under 20% root biomass growth reduction (Figure 7A). In contrast, a *Bc/Al_{crit}* ranged from 1–8 (average = 4.4) under the 5% root biomass growth reduction (Figure 7B). The ratio ranged from 3–6 for forests in eastern Canada (A and B ecozones), while ranges for the Boreal Shield ecozone were 2–4 and coastal forest in British Columbia were slightly higher at 3–4. Semi-natural grassland in the Prairies were given a ratio of 4.5 based on *Deschampsia*, but many fringe regions of the Prairies are treed and dominated by *Populus tremuloides*, which had a *Bc/Al_{crit}* of 8.

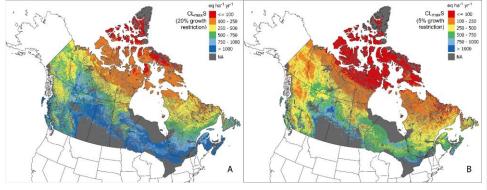


397

Figure 7: Critical base-cation-to-aluminum ratio (*Bc/Alcrit*) under a 20% growth reduction (A) and a 5% growth reduction (B). Site-specific ratios were selected for each 250 m grid cell for the most sensitive species (or genus or landcover type if no species data available). Note that while the legends have been matched for comparison, the maximum ratio in the 20% growth reduction map is 4.

402 3.5 Critical loads

403 The $CL_{max}S$ under the 20% protection level (i.e., allowing more damage) showed low sensitivity (> 1000 eq ha⁻¹ yr⁻¹) 404 to acidic deposition for most regions below 55°N latitude (Figure 8A). In contrast, under the 5% protection level 405 (Figure 8B), low sensitivity was limited to southern agricultural regions in the Prairies. Lowest CLmaxS and CLmaxN 406 were found in the Arctic territories (Nunavut, the Northwest Territories, the Yukon; Table 4) and also Newfoundland and Labrador (Figure 12B). Of the provinces, Quebec had the lowest CL_{max}S (314 eq ha⁻¹ yr⁻¹) and 407 408 $CL_{max}N$ (299 eq ha⁻¹ yr⁻¹) (Table 4). From an ecozone perspective the Mixedwood Plain ecozone had the highest 409 $CL_{max}S$ at 1586 eq ha⁻¹ yr⁻¹ followed by the Prairies at 1078 eq ha⁻¹ yr⁻¹. The most sensitive ecozones outside the 410 Arctic ecozones (which were below 100 eq ha⁻¹ yr⁻¹) were the Boreal Cordillera and the Taiga ecozones (Table 4). 411 For CL_{nul}N, central and northern regions of the country were sensitive to nutrient N deposition, particularly pastures, 412 grasslands, scrublands, and sparse forest in and surrounding the Prairies (Figure 9A). Further, very low $CL_{nut}N$ (<= 413 75 eq ha⁻¹ yr⁻¹ were estimated over the Arctic territories (Table 4) as well as in northern Alberta and the Athabasca 414 Basin in northern Saskatchewan. The coastal ecozones had the highest CL_nutN, with the Pacific and Atlantic 415 Maritime zones having 513 and 235 eq ha⁻¹ yr⁻¹ respectively. The Prairie ecozone had the lowest CL_{nul}N, lower than 416 some of the Arctic ecozones, at 63 eq ha⁻¹ yr⁻¹.



418 419

419 Figure 8: Maximum sulphur critical load ($CL_{max}S$) at a 20% growth restriction scenario (A) versus a 5% growth 420 restriction scenario (B), using reduced-anthropogenic (i.e., smoothed) Bc_{dep} .

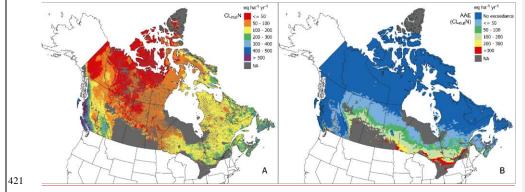


Figure 9: Critical load of nutrient nitrogen using the SMB model (A) and average accumulated exceedance of nutrient nitrogen (B) estimated under modelled total deposition of nitrogen from 2014–2016.

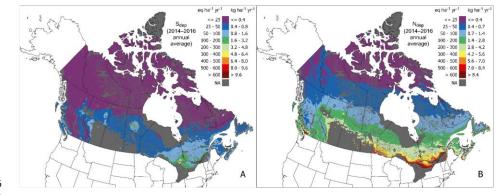
424

425 3.6 Deposition

426 Modelled average annual S_{dep} was below 25 eq ha⁻¹ yr⁻¹ for most of the country above 59°N, as well as the Montaine 427 Cordillera ecozone that covers much of British Columbia (Figure 9A10A). Southern Quebec and central Ontario 428 showed higher annual average values between 50–200 eq ha⁻¹ yr⁻¹, with some point sources showing S_{dep} in excess 429 of 500 eq ha-1 yr-1 (e.g., at nickel smelters and mining operations in Sudbury, Ontario and Thompson, 430 Manitoba). Southern Quebec and central Ontario showed higher annual average values between 50-200 eq ha+ yr+; 431 with some isolated point sources showing S_{dep} in excess of 500 eq ha⁴-yr⁴. Modelled average annual N_{dep} (Figure 432 9B) exceeded S_{dep} in most parts of the country. A north-south N_{dep} gradient is observable in Figure 10B, showing 433 higher N_{dep} closer to agricultural sources in southern Ontario and Quebec and in the Prairies. Nitrogen deposition

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434 exceeding 500 eq ha⁻¹ yr⁻¹ was present in northern Ontario and southern Quebec as well as southern Manitoba and 435 southwestern British Columbia.



436

 437
 Figure 109: Modelled total depositionannual average (2014–2016) total deposition of sulphur (Sdep, panel A) and nitrogen

 438
 (Ndep, panel B)-under average annual deposition from 2014–2016. Maps were sourced from GEM-MACH (Moran et al.,

 439
 2024a, b).

440 3.7 Exceedances

441 Widespread but low exceedances of acidity (< 50 eq ha⁻¹ yr⁻¹) under average 2014–2016 deposition were found in 442 regions in central and southern Quebec, Ontario, Manitoba, Alberta, British Columbia as well as in some regions in 443 Nova Scotia and Newfoundland, under both protection levels (Figure 4011). Further, exceedances above 200 eq ha⁻¹ 444 yr⁻¹ were predicted in southern Quebec and Ontario, as well as near Winnipeg and Vancouver, under both protection 445 levels. Exceedances of acidity under 2014–2016 S and N deposition were not generally predicted in the north. The 446 spatial extent of exceedance was slightly greater under the 5% protection limit as a result of higherlower $CL_{max}S$ and 447 $CL_{max}N$, particularly around point sources of S and N, such as the AOSR.

448

449 If the Bc_{dep} without smoothing is employed (i.e., the base cation deposition associated with high magnitude 450 anthropogenic sources is included), exceedances are reduced (see Figure $\frac{11}{2}(B)$ and compare to Figure $\frac{1011}{B}$).

451 The CL_{max} S based on anthropogenic-inclusive Bc_{dep} (at 5% protection level, Figure 11A12A) indicated that CL_{max} S is

- 452 elevated in the AOSR in comparison with the smoothed $CL_{max}S$ in Figure 8B.
- 453

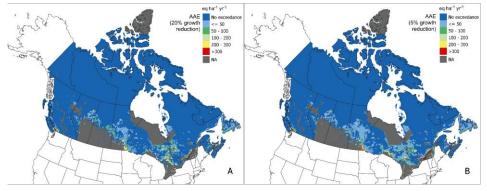
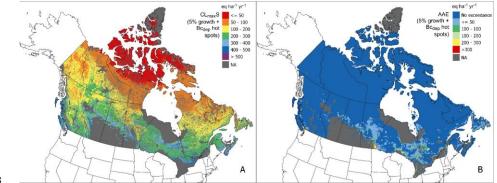
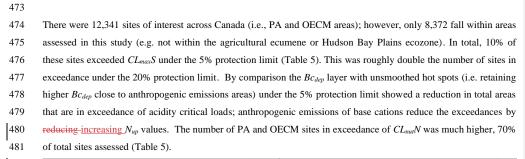
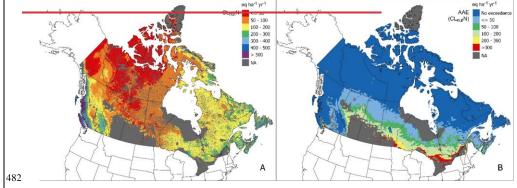


Figure <u>4011</u>: Average Accumulated Exceedance (AAE) of critical loads of acidity under 2014–2016 sulphur <u>plus and</u> nitrogen GEM-MACH modelled deposition. Two growth reduction scenarios are presented: using a chemical criterion representing 20% growth reduction (A) and 5% growth reduction (B).



459 460 461	Figure <u>1112</u> : A scenario <u>including-using</u> base cation deposition without smoothing, illustrating the impact of hot-spot Bc_{dep} on the maximum critical load of sulphur ($CL_{max}S$) (A) and the Average Accumulated Exceedance (AAE) under <u>average</u> 2014–2016 sulphur plus-and nitrogen GEM-MACH modelled deposition (B).
462	For CL _{mar} N, central and northern regions of the country were sensitive to nutrient N deposition, particularly pastures,
463	grasslands, scrublands, and sparse forest in and surrounding the Prairies (Figure 12A). Further, very low CL_meN (<=
464	75 eq ha ⁻⁺ -yr ⁺ -were estimated over the Arctie territories (Table 4) as well as in northern Alberta and the Athabasea
465	Basin in northern Saskatchewan (Figure 12A)Widespread exceedances of CL _{nul} N were predicted across most
466	provinces, with generally low AAE (< 50 eq ha ⁻¹ yr ⁻¹) extending to just north of 60° latitude, and higher values of
467	100-200 eq ha ⁻¹ yr ⁻¹ were predicted from Alberta east to Quebec (Figure 12B9B). Some regions adjacent to the
468	agricultural ecumene in the Prairies, southern Ontario, Quebec and the AOSR experienced values above 300 eq ha-1
469	yr ⁻¹ up to 1053 eq ha ⁻¹ yr-1; however, 80% of grid cells in exceedance fell below 300 eq ha ⁻¹ yr ⁻¹ . Some regions
470	adjacent to the agricultural ecumene in the Prairies, southern Ontario, Quebec and the AOSR experienced values
471	above 300 eq ha ⁺ -yr ⁻⁺ (Figure 12B).
470	





483 Figure 12: Critical load of nutrient nitrogen using the SMB model (A) and average accumulated exceedance of nutrient* 484 nitrogen (B) estimated under modelled total deposition of nitrogen from 2014–2016.

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 486
 Table 5: Exceedance summarized by number of Protected Areas (PA) and Other Effective area-based Conservation

 487
 Measures (OECM) areas (ECCC, 2023b) experiencing any exceedance. Three exceedance scenarios are presented:

 488
 Critical load of acidity exceedance at 5% and 20% growth reduction protection levels, unsmoothed base cation deposition

 489
 under the 5% scenario, and exceedance of nutrient nitrogen (*CLmuN*). Critical loads of acidity and nutrient nitrogen were

 490
 assessed under a multi-year (2014–2016) average GEM-MACH modelled sulphur and nitrogen total deposition.

	PA	OECM	% Exceeded
Number of sites	8,205	167	-
Exceeded (5% growth reduction)	793	17	9 <u>.7</u>
Exceeded (20% growth reduction)	313	10	3 <u>.9</u>
Exceeded (5% with hot spots)	445	14	5 <u>.5</u>
Exceeded ($CL_{nut}N$)	5,807	85	70 <u>.4</u>

491

492 4 Discussion

512

493 4.1 Uncertainties inof critical loads of acidity and nutrient nitrogen

494 Critical loads of acidity reflect the influence of BC_{we} , particularly in the north where cold annual temperatures slow weathering rates to almost zero. However, areas near the Canada-U.S. border also showed lower BCwe rates by 200-495 496 300 eq ha⁻¹ yr⁻¹ when corrected for temperature (Figure 4). Soil depth remains a poorly mapped parameter that has significant impact on BCwe, and it is worth noting that average estimates were based on mapped soil depths (Hengl, 497 498 2017), which ranged from 1 cm to a maximum rooting depth of 30 or 50 cm. While comparison between mapped 499 values and site-level values is difficult (due to methodological differences and spatial representation), there are some 500 studies which have observational values in representative areas; for example, in northern Saskatchewan, 50% of 107 501 sites were estimated below 300 eq ha⁻¹ yr⁻¹, slightly above our mapped estimates of 230 eq ha⁻¹ yr⁻¹ for (primarily 502 northern) Saskatchewan (Table 4; Figure 4). Estimates for conifer stands in Québec by Ouimet et al. (2001) were 210 eq ha⁻¹ yr⁻¹, comparable to the mean 229 eq ha⁻¹ yr⁻¹ estimated for the Boreal Shield ecozone in our study (Table 503 504 4). In British Columbia, Mongeon et al. (2010) found BC_{we} to be 710 eq ha⁻¹ yr⁻¹, much greater than the 235 eq ha⁻¹ yr⁻¹ estimated in our study for the Pacific Maritime ecozone. Koseva et al., (2010) estimated BC_{we} at 10 sites in 505 506 Ontario primarily in the Mixedwood Plains ecozone at 628 eq ha⁻¹ yr⁻¹ (compared to 306 eq ha⁻¹ yr⁻¹ over the 507 Mixedwood Plains in our study). Moreover, Koseva et al. suggest that the soil-texture approximation method (as 508 used in our study) under-estimates BC_{we} in comparison to the better-preforming PROFILE model. Assessments of 509 uncertainty in critical load estimates recognize BC_{we} as the primary driver of uncertainty (Li and <u>MenultyMcNulty</u>, 510 2007; Skeffington et al., 2006) and, as such, observational data and PROFILE-modelled site data to constrain 511 weathering rates would greatly improve critical load estimates.

513 While the inclusion of a modelled B_{Cdep} map represents an improvement over previous Canadian critical load-map 514 projects, several factors likely contribute to the Bcdep modelled negative bias (which has appeared in other 515 publications, such as Makar et al., 2018), and and may relate to how emissions processing has been carried out for 516 air-quality models in North America. While anthropogenic emissions inventories include estimates of PM_{2.5}, PM₁₀ 517 and PM_{total} mass emissions, usually only PM_{2.5} and PM₁₀ emissions are used in determination of model input 518 emissions. However, substantial emitted base cation mass may reside in the larger size fractions (between the mass 519 included within PM10 and the PMtotal). The model version and emissions inventory data used in the base cation 520 deposition estimates of AQMEII4 included only emissions up to 10 µm diameter, as did work examining emissions 521 from multiple sources of primary particulate matter (Boutzis et al., 2020). Subsequent work using observations from 522 the Canadian Oil Sands and reviewing other sources of data subsequent toafter Boutzis et al. (2020) and Galmarini 523 et al. (2021) suggest that many of the same sources of anthropogenic particulate matter emissions include emitted 524 particles between 10 and 40 µm diameter, the mass of which adds an additional 66% relative to the PM 2.5 to PM10 525 "coarse mode" emitted mass. For forest fire emissions, this additional mass is much larger. The wildfire particulate 526 matter size distributions of Radke et al. (1988; 1990) used to estimate mass up to PM₁₀ in Boutzis et al. (2020) show 527 that the emitted particle mass between 10 and 40 μm diameter is 7.26 times× that emitted between PM_{2.5} and PM₁₀. Approximately 9.7% of this particle mass is composed of base cations (e.g., Table S5 of Chen et al., 2019). A third 528

factor is another natural emissions source, aeolian or wind-blown dust emissions (e.g., Bullard et al., 2016; Park et al., 2010), which was not included in the AQMEII4 simulations. These (traditionally missing) sources of base cation mass in air-quality models likely contribute to the substantial negative bias noted here. Nevertheless, regression in Figure 3 suggests that the spatial distribution of base cations emissions and deposition from Galmarini et al. (2021) is reasonable, and we have used the relationship between modelled and observed values to provide corrected estimates of Bc_{dep} .

535

536 The conservative 5% protection level set for the Bc/Alcrit is favoured by the authors of the current work for critical 537 loads estimates, which affords greater ecosystem protection consistent with studies using Bc/Al > 1 (e.g. McDonnell 538 et al., 2023; Mongeon et al., 2010; Ouimet et al., 2006). Historically, when acidic deposition was higher than at 539 present, a 20% growth reduction was a reasonable target. However, under decreasing emissions and deposition, as 540 well as acceptable impacts to wood production, carbon storage, and ecosystem health there is greater certainty in 541 ecosystem protection under the 5% protection level. It should be noted that the level of protection is a policy 542 decision regarding how much should be protected, rather than a sensitivity. It should be noted that the level of 543 protection is an ethical choice regarding how much should be protected, rather than a sensitivity, and taking the most 544 sensitive species through the Bc/Alcrit selection process ensures the highest possible protection based on species-545 specific dose-response curves. Note, however, that changes to forest health and climate may also induce pressures 546 that are not captured in the selection of the Bc/Alcrit from the studies described in Sverdrup & Warfvinge (1993). 547

548 <u> $CL_{nul}N$ seems to be driven primarily by *Q* rather than by vegetation cover; low $CL_{nul}N$ was seen in regions of 549 correspondingly low *Q* values (e.g., >50 mm yr⁻¹) in much of the Arctic and central Canada. In contrast, areas with 550 high *Q* were found to result in high $CL_{nul}N$; as previously suggested by Reinds et al. (2015), a critical flux rather 551 than concentration may provide more reliable critical loads in regions with elevated precipitation such as the Pacific</u>

552 Maritime ecozone in British Columbia.

Low *CL_{mut}N* in the Arctie was driven by very low Q values on thin barren land covers. In contrast, areas with high Q were found to result in high *CL_{mut}N*; as previously suggested by Reinds et al. (2015), a critical flux rather than concentration may provide more reliable critical loads in regions with elevated precipitation such as the Pacific Maritime ecozone in British Columbia.

557

The omission of wetlands, which cover an estimated 13% of land in Canada, from acidity and nutrient N critical loads represents a gap in terrestrial (and aquatic) ecosystem protection. Although there are modifications to the SMB model that address critical loads for wetlands, this study was limited by the availability of a suitable national wetlands classification map. Future studies may address this data gap as wetland classification products become available.

563 4.2 Exceedances of critical loads

580

564 Historically, forests in eastern Canada were regarded as the region ecosystems most susceptible to acidification due 565 to their underlying geology, shallow soil type, vegetation, and elevated acidic deposition from domestic and 566 transboundary air pollution. This study adds to the body of literature supporting recent studies in both terrestrial and 567 aquatic critical loads (e.g., Makar et al., 2018; Cathcart et al., 2016; Williston et al., 2016; Mongeon et al., 2010; 568 Whitfield et al., 2010), showing likely exceedance of critical loads of acidity in central and western Canada (i.e., in 569 regions such as Alberta, Saskatchewan and British Columbia). The prevalence of our predicted widespread 570 exceedances in Manitoba (Figure 10) may reflect low mineral soil depth, as organic soil dominates this part of the 571 country. Further, point sources (generally large mining or smelting operations) remain a concern (e.g., in southern Manitoba, the AOSR, and southern British Columbia) with regard to sharply elevated local exceedance, which may 572 573 be temporally mitigated by elevated Bcdep from co-located dust emissions sources. Additionally, high Bcdep can have 574 an alkalinizing impact on ecosystems. In China, where elevated B_{Cdep} emissions from industrialization have 575 historically mitigated the effects of acidic deposition in many regions, successful particle emissions mitigation 576 strategies have reduced Bcdep in recent years (as S and N deposition have declined), resulting in increased critical 577 load exceedance (Zhao et al., 2021). However, the steady-state assumptions of the SMB require non-anthropogenic 578 Bcdep, since they must reflect long-term conditions, and base cation emissions cannot be reliably coupled with 579 changes to those of S and N and should be considered separately.

Widespread CL_{nul}N exceedance (found in the majority of the PA and OECM sites assessed) suggests that nutrient N 581 582 may present a risk to biodiversity at many sites under protective measures. However, 40% of the grid cells showing 583 $CL_{nut}N$ exceedance were below 50 eq ha⁻¹ yr⁻¹ and it is likely that many of these exceedances are within the 584 uncertainty of the model. While some empirical studies of nutrient N have been done in Canada, a large knowledge 585 gap exists for many Canadian ecosystems regarding the effect of nutrient nitrogen and their critical loads. Some 586 work has developed on Jack pine and northern ecosystems; Vandinthner suggested that across Jack pine-dominant 587 forests surrounding the AOSR, the biodiversity-based empirical critical load of nutrient N was 5.6 kg ha⁻¹ yr⁻¹ (400 588 eq ha⁻¹ yr⁻¹; Vandinther and Aherne, 2023a) which is above the maximum $CL_{put}N$ calculated in this study within 200 589 km of the AOSR (216 eq ha⁻¹ yr⁻¹). Further, in low deposition 'background' regions a biodiversity-based empirical 590 critical load of 1.4 - 3.15 kg ha⁻¹ yr⁻¹ (100 - 225 eq ha⁻¹ yr⁻¹) was found to protect lichen communities and other N-591 sensitive species in Jack pine forests across Northwestern Canada (Vandinther and Aherne, 2023b); these are again 592 higher compared to mean values in this study (e.g. for the Boreal Plain, 76 eq ha⁻¹ yr⁻¹). Empirical critical loads 593 developed for ecoregions in Northern Saskatchewan (Murray et al., 2017) fall into a range of 88 – 123 eq ha⁻¹ yr⁻¹, 594 again higher than values suggested by this study (e.g. 62 eq ha⁻¹ yr⁻¹ in Saskatchewan). In comparison to these 595 empirical values, CL_{nut}N values in the current work are lower by a factor of 2. If CL_{nut}N is doubled, only 10% of the 596 soils assessed are in exceedance (versus 31% of soils). This reduction in the areal exceedance would in turn reduce 597 the number of PA and OECM sites in exceedance. While the spatial pattern of CL_{nut}N exceedances does not 598 generally follow exceedances of critical loads of acidity, some areas (including PA and OECM sites) in central 599 Canada were estimated to be in exceedance of both critical loads of acidity and nutrient N, suggesting that this

600 region may be of particular concern. Given the largest areal exceedance is of CL_{nut}N, observational studies with the 601 view of expanding Canadian ecosystem empirical critical loads would help determine how, and by how much, 602 Canadian ecosystems are affected by N_{dep} and how well these observations align with CL_{nul}N in the current work. 603 Additionally, vegetation community changepoint modelling such with the TITAN model (Baker, 2010) could help 604 bring understanding to how Canadian ecosystems might experience elevated N_{dep} with regard to changes in 605 biodiversity. Widspread CLmud N exceedance (found in the majority of the PA and OECM sites assessed) suggests that 606 nutrient N may present a risk to biodiversity at many sites under protective measures. While some empirical studies 607 of nutrient N have been done in Canada, a large knowledge gap exists for many Canadian ecosystems regarding the 608 effect of nutrient nitrogen and their critical loads. Some work has developed on Jack Pine and northern ecosystems; 609 Vandinthner suggested that across Jack pine-dominant forests surrounding the AOSR, the biodiversity-based 610 empirical critical load of nutrient N was 5.6 kg ha⁻¹ yr⁻¹ (400 eq ha⁻¹ yr⁻¹; Vandinther and Aherne, 2023a) which is 611 above the maximum CLmuN calculated in this study within 200 km of the AOSR (216 eq ha+ yr+). Further, in low 612 deposition 'background' regions a biodiversity based empirical critical load of 1.4 - 3.15 kg ha⁻¹ yr⁻¹ (100 - 225 eq 613 ha-+ yr-+) was found to protect lichen communities and other N-sensitive species in Jack pine forests across 614 Northwestern Canada (Vandinther and Aherne, 2023b); these are again higher compared to mean values in this 615 study (e.g. for the Boreal Plain, 76 eq ha⁻¹ yr⁻¹). Empirical critical loads developed for ecoregions in Northern 616 Saskatchewan (Murray et al., 2017) fall into a range of 88 – 123 eq ha⁺-yr⁺, again higher than values suggested by 617 this study (e.g. 62 eq ha⁻¹ yr⁻¹ in Saskatchewan). While the spatial pattern of CL_{mut}N exceedances does not generally 618 follow exceedances of critical loads of acidity, some areas (including PA and OECM sites) in central Canada were 619 estimated to be in exceedance of both critical loads of acidity and nutrient N, suggesting that this region may be of 620 particular concern.

622 5 Conclusions

This study mapped critical loads of acidity and nutrient nitrogen for terrestrial ecosystems the using the steady-state SMB model. The modelling approach used (a) high-resolution national maps of soils, meteorology, and forest composition, (b) high-resolution modelled Canada-wide Bc_{dep} , and (c) species-specific chemical criteria for damage. The resulting national critical loads of acidity and nutrient N for Canadian terrestrial ecosystems were mapped at a 250 m resolution. The influence of different levels of protection and Bc_{dep} models-to several parameters was also explored, including two vegetation protection levels (5% and 20% root biomass growth reduction scenarios) and anthropogenic base cation deposition "hot spots".

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Further, exceedance was predicted at 10% (acidity) and 70% (nutrient nitrogen) of the assessed sites (PA and OECM) where preserving biodiversity is a national policy goal, suggesting that current levels of N deposition may

be affecting a large majority of these ecologically important sites. Soil recovery from acidic deposition is a slow process that may take decades or even centuries to reach pre-acidification levels, which cannot begin until deposition falls below critical loads. Parameterization of the SMB model specifically for Canadian ecosystems is a step forward in refining Canadian terrestrial critical loads, and the maps produced by this study are a valuable tool in identifying and assessing regions sensitive to acidic deposition and nutrient N deposition, as well they provide as providing a foundation for more refined provincial estimates.

642 CRediT authorship contribution statement

H. Cathcart: Conceptualization, Data curation, Investigation, Methodology, Formal analysis, Visualization, Writing
- original draft, Writing – review & editing. J. Aherne: Formal analysis, Methodology, Writing – review &
editing. M.D. Moran: Data curation, Investigation, Methodology, Writing – original draft, Writing – review &
editing. V. Savic-Jovcic: Data curation, Investigation. P.A. Makar: Investigation, Methodology, Writing – original
draft, Writing – review & editing. A.D Cole: Writing – review & editing.

648 Competing interests

649 The authors declare that they have no conflict of interest.

650 Data availability

Raster files of critical load maps (*Cl_{max}S*, *CL_{max}N*, *CL_{min}N*, *CL_{nui}N*) will be made available on the Government of
Canada's Open Data Portal under Environment and Climate Change Canada's records
(https://open.canada.ca/data/organization/ec) at https://doi.org/10.18164/ec5c8bbb-3bc8-4675-a9c6-103addd874b8.

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663 <u>Canada, 2024.</u>

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