

High latitude vegetation changes will determine future plant volatile impacts on atmospheric organic aerosols

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2 **aerosols**

3

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15 Abstract

16 Strong, ongoing high latitude-warming is causing changes to vegetation composition and plant productivity,
17 modifying plant emissions of Biogenic Volatile Organic Compounds (BVOCs). In the sparsely populated high
18 latitudes, climatic feedbacks resulting from BVOCs as precursors of atmospheric aerosols could be more
19 important than elsewhere on the globe. Here, we quantitatively assess the linkages between vegetation changes,
20 BVOC emissions and secondary organic aerosol (SOA) under different climate scenarios and show that
21 warming-induced vegetation changes determine the spatial patterns of BVOC impacts on SOA. The northward
22 advances of boreal needle-leaved trees and shrubs result in an increase of up to 45% in regional SOA optical
23 depth, causing a cooling feedback. In contrast, areas dominated by temperate broad-leaved trees show a large
24 decline in monoterpene emissions and SOA formation, causing a warming feedback. We highlight the necessity
25 of considering vegetation shifts when assessing radiative feedbacks on climate following the BVOC-SOA
26 pathway.

27

28

29 Main

30 The northern high latitudes are experiencing stronger warming than the global average and this warming is
31 reflected in observed changes to vegetation composition, plant traits and plant productivity^{1,2}, which could
32 profoundly alter the magnitude and composition of plant-emitted Biogenic Volatile Organic Compounds
33 (BVOCs)³. Warming-induced permafrost thaw could release previously-locked nutrients, abating nutrient
34 limitations and thereby supporting enhanced plant productivity and growth in this region^{4,5}. The predicted
35 increase of atmospheric CO₂ concentration might, however, inhibit BVOC production as has been
36 experimentally shown for isoprene synthesis under elevated CO₂^{6,7}. However, it remains unclear how the BVOC
37 emissions might respond to the fast and combined environmental changes in the high latitudes.

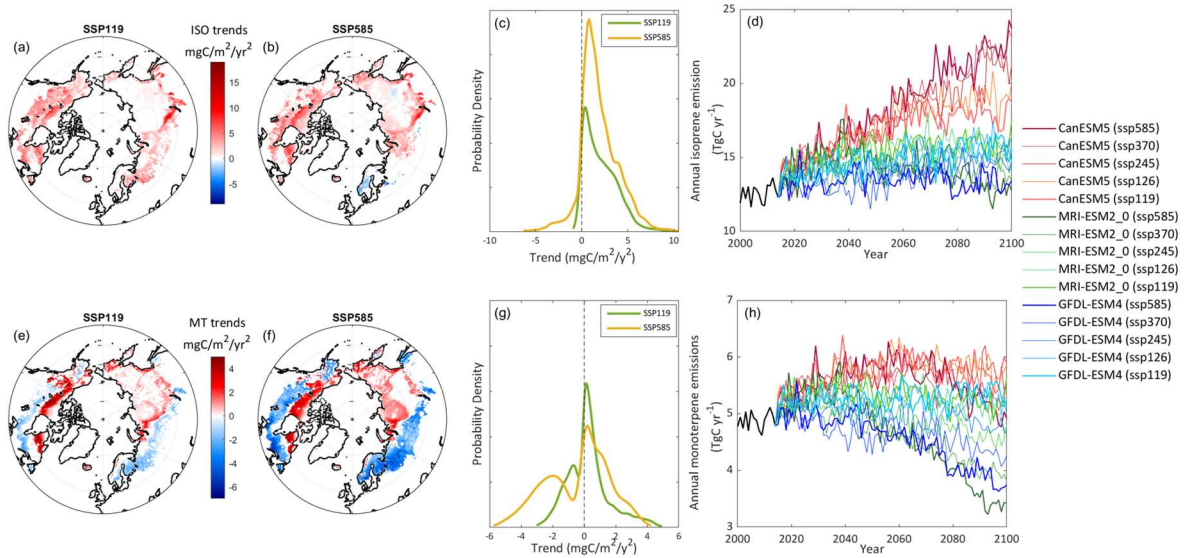
38 Plant-emitted BVOCs participate in a series of chemical reactions in the atmosphere, which influences
39 atmospheric oxidation capacity⁸, tropospheric ozone concentrations⁹, and increase the concentrations of
40 secondary organic aerosol (SOA) and cloud condensation nuclei (CCN)^{10,11}. In the high latitude atmosphere, the
41 anthropogenic sources of aerosols and CCN are generally lower than in denser inhabited regions^{12,13}. Thus, the
42 warming-induced vegetation changes and the following alterations in BVOC emissions may provide stronger

43 feedbacks to the high latitude climate system through modulating atmospheric SOA and CCN concentrations
44 than elsewhere on the globe. Despite this, the biochemical and biophysical BVOC-mediated feedbacks to the
45 climate have been largely ignored in the high latitudes¹². Furthermore, previous estimates of high latitude BVOC
46 emissions are highly uncertain^{14,15} due to the scarcity of observation-based emission data and/or
47 underrepresented plant variations in large-scale modelling, particularly in the tundra biome³. Here, we
48 quantitatively assess future BVOC dynamics in the Arctic and boreal regions, elucidate key processes driving the
49 trends in BVOC emissions and illustrate the contribution of BVOC emissions to our climate system through
50 SOA-CCN-climate feedbacks.

51 **Future changes in isoprene and monoterpene emissions**

52 We explore both historical and future emission changes of the dominant BVOCs, isoprene and monoterpenes,
53 using a dynamic vegetation model, LPJ-GUESS¹⁶. The model, driven by climate data, simulates plant
54 competition and vegetation composition change, as well as plant and soil biochemical processes in response to
55 changing environmental conditions (Methods). Observation-based BVOC emission rates and temperature
56 response curves, together with a detailed representation of tundra plant functional types (PFTs) have allowed to
57 simulate BVOC emissions for the Arctic area^{3,17}. Details of model evaluations over different historical periods
58 can be found in the Extended Data Figs 1-3 and Extended Data Table 1.

59 For the future period (2015-2100), we select climate projections from three General Circulation Models (GCMs)
60 following five different Shared Socioeconomic Pathways (SSPs) under the CMIP6 framework¹⁸ and implement
61 bias-correction of these climate predictions of temperature, precipitation and radiation before using them to drive
62 LPJ-GUESS (Methods). The resulting 15 scenarios (see overview of the scenarios in Extended Data Table 2 and
63 future anomalies of temperature, precipitation and radiation in the Extended Data Fig. 4) represent SSPs with
64 varying greenhouse gas projections and GCMs with different climate sensitivities in the study region (tundra and
65 boreal biomes based on RESOLVE ecoregions²⁰¹⁷¹⁹). We use the LPJ-GUESS outputs driven by these 15
66 climate projections (hereafter standard runs) to explore future BVOC emissions.



67
68
69 *Figure 1. LPJ-GUESS modelled trends of isoprene and monoterpene emissions for the period of 2001-2100. (a-b): Modelled*
70 *isoprene (ISO) trends for SSP119 and SSP585, respectively. The trends are analysed based on the averaged emissions over 3*
71 *General Circulation Models (GCMs) and only significant trends (Mann-Kendall trend test, $p < 0.05$) are shown; (c)*
72 *Probability density function of significant trends in isoprene emission; (d) Time series of areal total isoprene emissions for*
73 *all standard runs driven by 3 GCMs following 5 SSPs; (e-f): Modelled monoterpene (MT) trends for SSP119 and SSP585,*
74 *respectively. The trends are analysed based on the averaged emissions over 3 GCMs and only significant trends (Mann-*
75 *Kendall trend test, $p < 0.05$) are shown; (g) Probability density function of significant trends in monoterpene emissions; (h)*
76 *Time series of areal total monoterpene emissions for all standard runs driven by 3 different GCMs following 5 SSPs.*
77 *SSP119: Shared Socioeconomic Pathway 1 reaching radiative forcing of 1.9 W/m^2 in 2100. SSP585: Shared Socioeconomic*
78 *Pathway 5 reaching radiative forcing of 5.8 W/m^2 in 2100.*

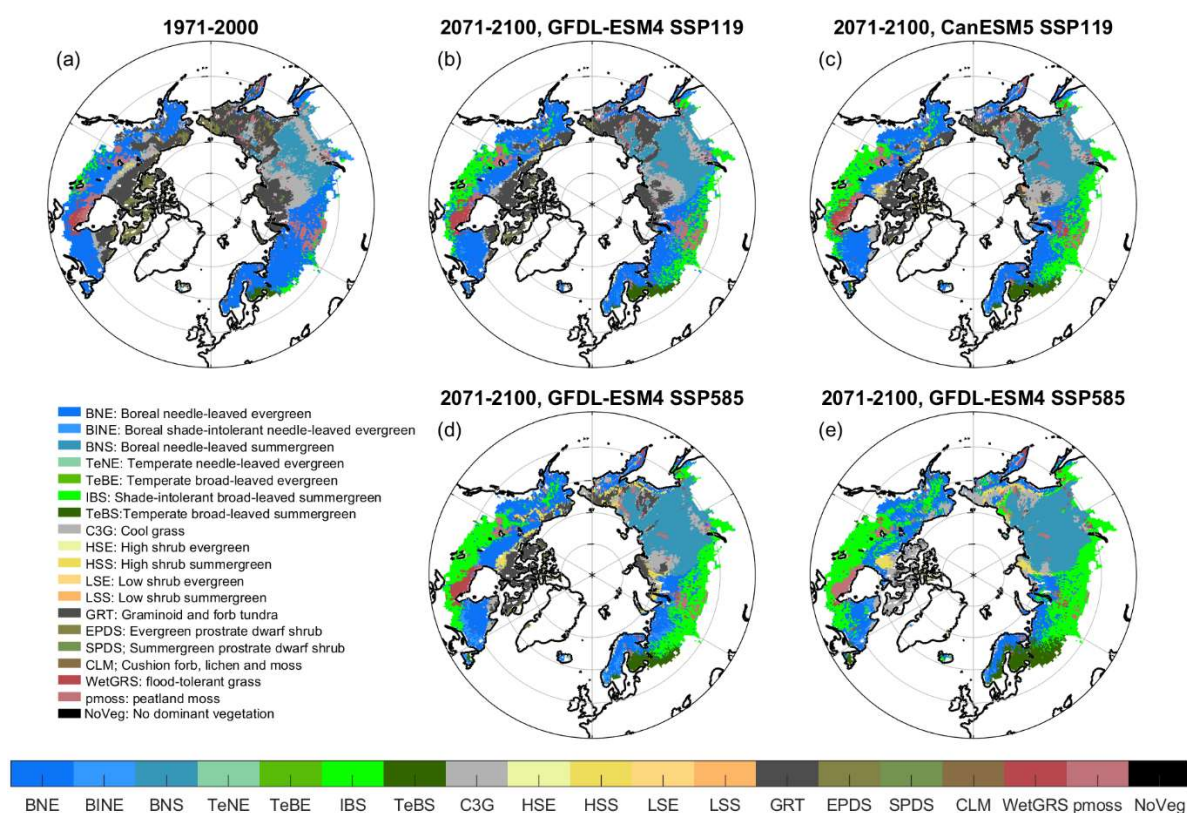
79

80 We simulate a clear increase in the areal total of annual isoprene (increase by 74-120% by the 2100) and
81 monoterpene (11-36% by the 2100) emissions for the runs driven by CanESM5 under different SSPs (Fig. 1d,
82 1h). For the simulations driven by scenarios combining a more moderate temperature increase with high CO₂
83 concentration (such as MRI-ESM2_0 SSP585 and GFDL-ESM4 SSP585, see temperature anomalies in
84 Extended Data Fig. 4a), the total isoprene emissions show moderate increases and the total monoterpene
85 emissions show clear decreases (Fig. 1h).

86 Spatially, isoprene emissions significantly increase in many regions, with the largest increasing trends simulated
87 in regions where the dominant PFTs shift strongly (Fig. 2). The projected shifts include the replacement of
88 boreal needle-leaved evergreen trees with broad-leaved deciduous trees (shift from PFT BNE to PFT IBS in Fig.
89 2) in northern Canada and western Russia, and a northward movement of boreal needle-leaved evergreen trees
90 replacing herbaceous vegetation and shrubs in eastern Russia, Alaska and north-eastern Canada (See BNE in
91 these regions in Fig. 2b-e). In the High Arctic, shrub abundance increases strongly, especially under CanESM5
92 SSP585 (See HSS in Fig. 2 and latitudinal fractions of each PFT in Extended Data Fig. 6b). These modelled PFT

93 shifts are in agreement with predictions based on different approaches^{20,21} and consistent with paleo-records of
 94 warm periods²².

95 Compared with the increasing trends under SSP119, the modelled isoprene emissions under SSP585 in
 96 Scandinavia show decreasing trends, which might be linked to the strong CO₂ inhibition of isoprene
 97 production²³, since the atmospheric CO₂ concentrations reach up to 1100 ppm by the end of the 21st century. For
 98 monoterpenes, the largest increasing trends occur in northern Canada and Russia (mainly for SSP585), where
 99 boreal needle-leaved evergreen (in Canada) and needle-leaved deciduous (in Russia) trees with relatively high
 100 emission capacities replace the isoprene-emitting grass PFT in the simulations. In the southernmost study
 101 regions, we observe a clear decrease in monoterpene emissions, especially under SSP585 (Fig. 1f), as the
 102 widespread broad-leaved, isoprene-emitting, deciduous trees replace monoterpene-emitting boreal needle-leaved
 103 trees. These unfavourable vegetation shifts for monoterpenes accompany with high atmospheric CO₂ increase in
 104 this climate prediction. In general, the predicted changes in isoprene and monoterpene emissions vary among
 105 climate scenarios, in agreement with global studies²⁴, and show regionally varying responses linked to the shifts
 106 of dominant vegetation.

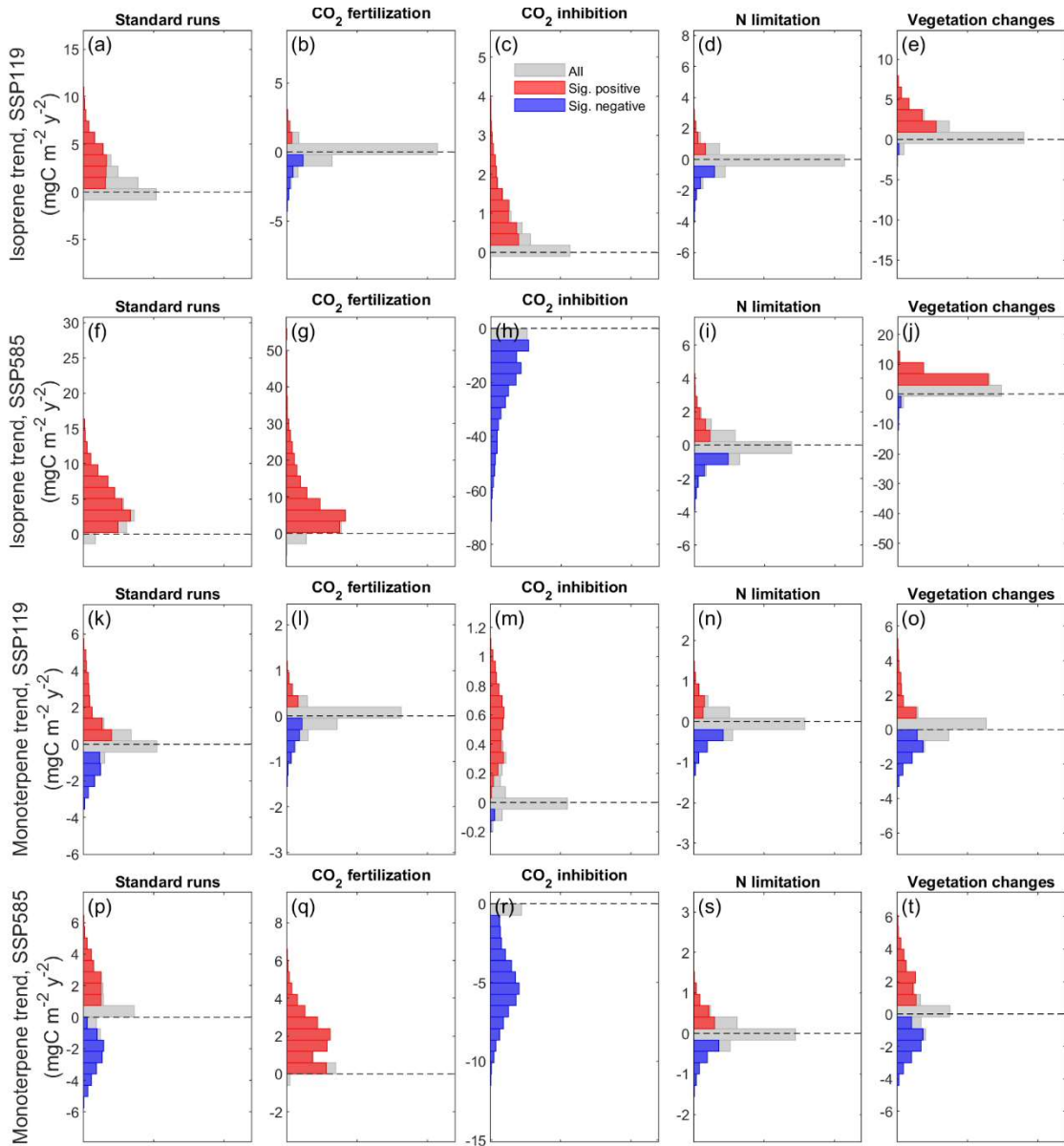


107
 108 *Figure 2. Distribution of the dominant plant functional types (PFTs) over the period 1971-2000 (a) and 2071-2100 (b-e)*
 109 *based on the modelled leaf area index. The outputs from the scenario SSP119 are shown in b-c, and the outputs from SSP585*
 110 *are shown in d-e. The outputs from two GCMs are plotted separately: GFDL-ESM4 (b,d), and CanESM5 (c,e).*

111

112 Key processes regulating future BVOC trends

113 Changing temperature and atmospheric CO₂ concentration can exert direct impacts on BVOC synthesis⁶⁻⁸. On
114 top of that, syntheses of isoprene and monoterpenes are linked to plant photosynthesis^{23,25,26}. Atmospheric CO₂
115 concentration, soil nitrogen availability as well as climate conditions not only alter photosynthetic rates, but also
116 vegetation dynamics, including plant growth and competition, migration as well as mortality, indirectly
117 influencing BVOC emission magnitudes and composition. In this study, we investigate the following four
118 drivers: climate, vegetation changes, atmospheric CO₂ concentration, and nitrogen (N) availability, and run
119 different factorial simulations based on CanESM5 SSP119 and SSP585. We design four factorial experiments:
120 (1) constant CO₂ concentration at year 2014 level for the future period (hereafter noCO₂); (2) setting CO₂
121 inhibition impacts on BVOC production as in 2014 (noCO₂Inhibition); (3) adding 50 kg N/ha/yr to annual
122 nitrogen deposition to reduce nitrogen limitation (noNlim). This N addition corresponds to what has been
123 implemented in forest N fertilization trials in Davies-Barnard, et al. ²⁷; (4) using the monthly averages of climate
124 drivers from the period 2005-2014 for driving ecosystem processes, but keeping the predicted future climate for
125 BVOC synthesis in the model for the future period 2015-2100 (noVegDym). Subsequently, we calculate the
126 differences between the standard and factorial simulations (Extended Data Table 3) to tease apart the relative
127 importance of CO₂ fertilization, CO₂ inhibition of BVOC production, N limitation and vegetation changes as
128 determinants of spatial and temporal patterns of future BVOC emissions (Fig. 3).



129

130 *Figure 3 Histograms of trends in modelled isoprene (first row for CanESM5 SSP119, and second row for CanESM5 SSP585)*
 131 *and monoterpene (third row for CanESM5 SSP119, and fourth row for CanESM5 SSP585) emissions from standard runs and*
 132 *from four investigated processes. Trends are analysed using Mann-Kendall test, and both significant positive and significant*
 133 *negative trends ($p < 0.05$) are marked on as red and blue bars, respectively. Please note the change of scales on the y-axes.*
 134 *Sig.: Significant.*

135

136 We find that under the low CO₂ emission scenario (CanESM5 SSP119), the overall positive trend in isoprene
 137 emissions is largely driven by vegetation changes (Fig. 3a, e). The small increasing emission trends by CO₂
 138 inhibition in both isoprene and monoterpene emissions are driven by decreasing atmospheric CO₂ concentrations
 139 towards the end of the century (see CO₂ inhibition in Fig. 3c, m). Overall, the impacts from CO₂ fertilization and
 140 N limitation are rather limited for both isoprene and monoterpenes under CanESM5 SSP119 (Fig. 3b, d, l, n).

141 Under the high CO₂ emission scenario (CanESM5 SSP585) with associated stronger warming and large
142 increases in N deposition, the positive trends in isoprene emissions are associated with CO₂ fertilization of
143 photosynthesis and vegetation changes but are simultaneously negatively influenced by CO₂ inhibition of BVOC
144 production (Fig. 3g, h, j). Climate warming-induced vegetation changes promote the overall positive trend in
145 isoprene (Fig. 3j), but not in monoterpene emissions, as depicted by the interplay between positive and negative
146 impacts under CanESM5 SSP585 (Fig. 3t). The impacts from N limitation are again very small, likely linked to
147 the increased N deposition during this century in CanESM5 SSP585 and increased sources of mineral N from
148 warming soils (data not shown here).

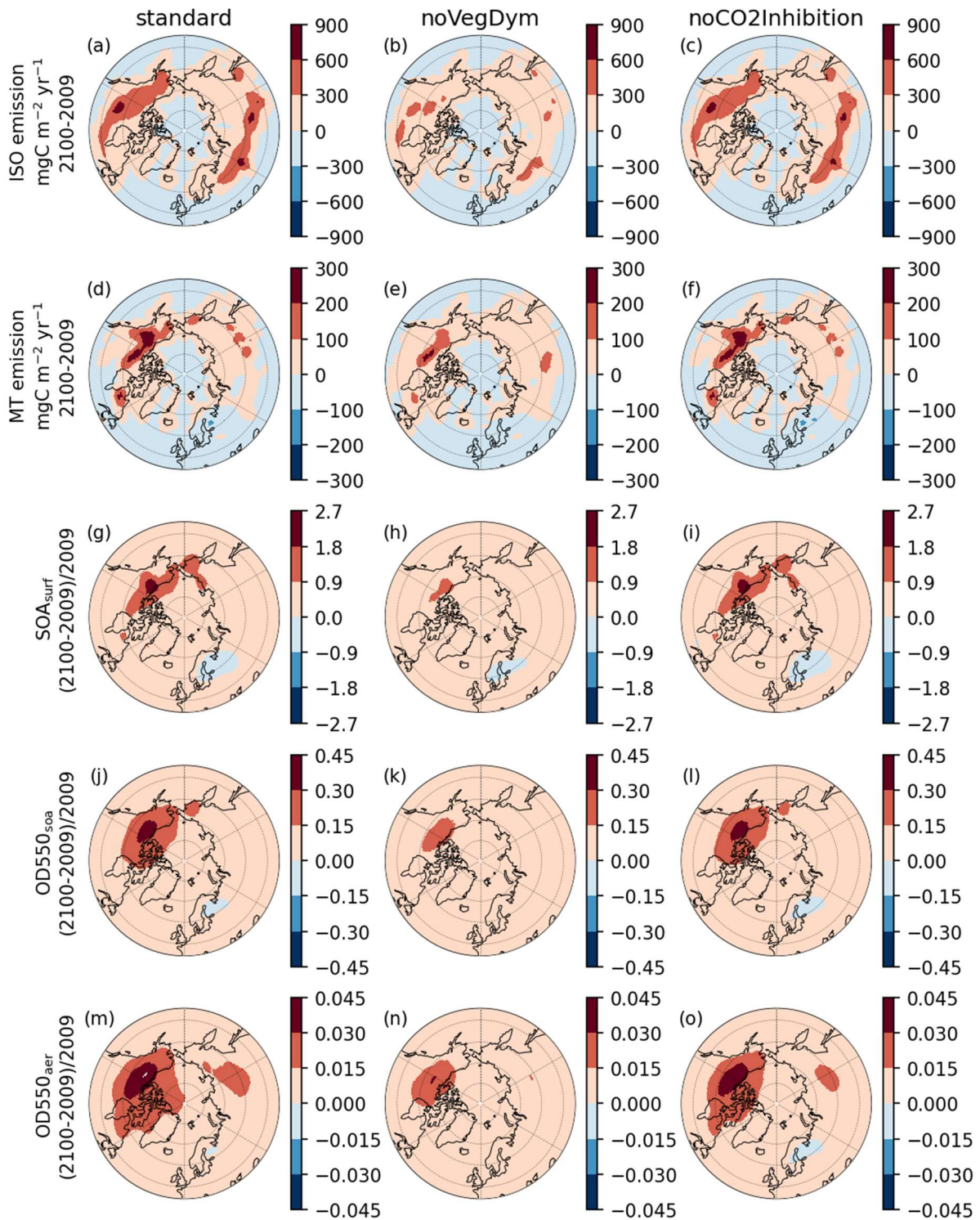
149 150 BVOC impacts on regional atmosphere

151 The modelled BVOC emissions, together with vegetation status (including leaf area index, LAI and vegetation
152 cover fraction) of the years 2009 and 2100 from standard runs driven by CanESM5 SSP119 and CanESM5
153 SSP585 are fed into the global chemistry transport model version 5 (TM5, Bergman, et al. ²⁸) to quantify the
154 impacts of isoprene and monoterpene emissions on surface SOA concentrations (SOA_{surf}), SOA optical depths at
155 550 nm (OD550_{SOA}) and aerosol optical depths at 550 nm (OD550_{aer}). The outputs from two of the factorial
156 experiments that contribute most to the simulated BVOC trends (Fig 3, noCO2inhibition and noVegDym) (Fig.
157 3) driven by CanESM5 SSP585 and CanESM5 SSP119 are also used as inputs for TM5 (see Methods for the
158 detailed setup for TM5).

159 Our results demonstrate the important role of climate change-driven vegetation changes in regulating the spatial
160 patterns of BVOC impacts on regional atmospheric aerosols. The increased BVOC emissions have largely
161 contributed to the increase in surface concentration of SOA (SOA_{surf}) for a major part of the study region, with a
162 smaller area of increase for CanESM5 SSP119 than for CanESM5 SSP585 (Fig. 4g & Fig. 5g). Under both SSP
163 scenarios, we see an up to 2.7-fold increase of SOA_{surf} in northern Canada and Russia in the standard run. The
164 simulation without vegetation responses to climate change (noVegDym) depicts a considerably lower increase
165 (Fig. 4h and Fig. 5h). The standard runs with vegetation changes show stronger and vaster increases in aerosol
166 optical depth (OD550_{SOA} and OD550_{aer}, 41% and 4.9% increase under CanESM5 SSP119, Fig. 4 j&m, and 29 %
167 and 4.1% increase under CanESM5 SSP585, Fig. 5 j&m, respectively). Without vegetation changes
168 (noVegDym), only a limited increase of OD550_{SOA} and OD550_{aer} in a small region in the central and eastern
169 Canada is simulated. The strong spatial linkages, which we show for vegetation shifts, BVOC dynamics and
170 SOA/aerosol changes are ignored when using static vegetation distributions for future conditions¹⁴. Under the

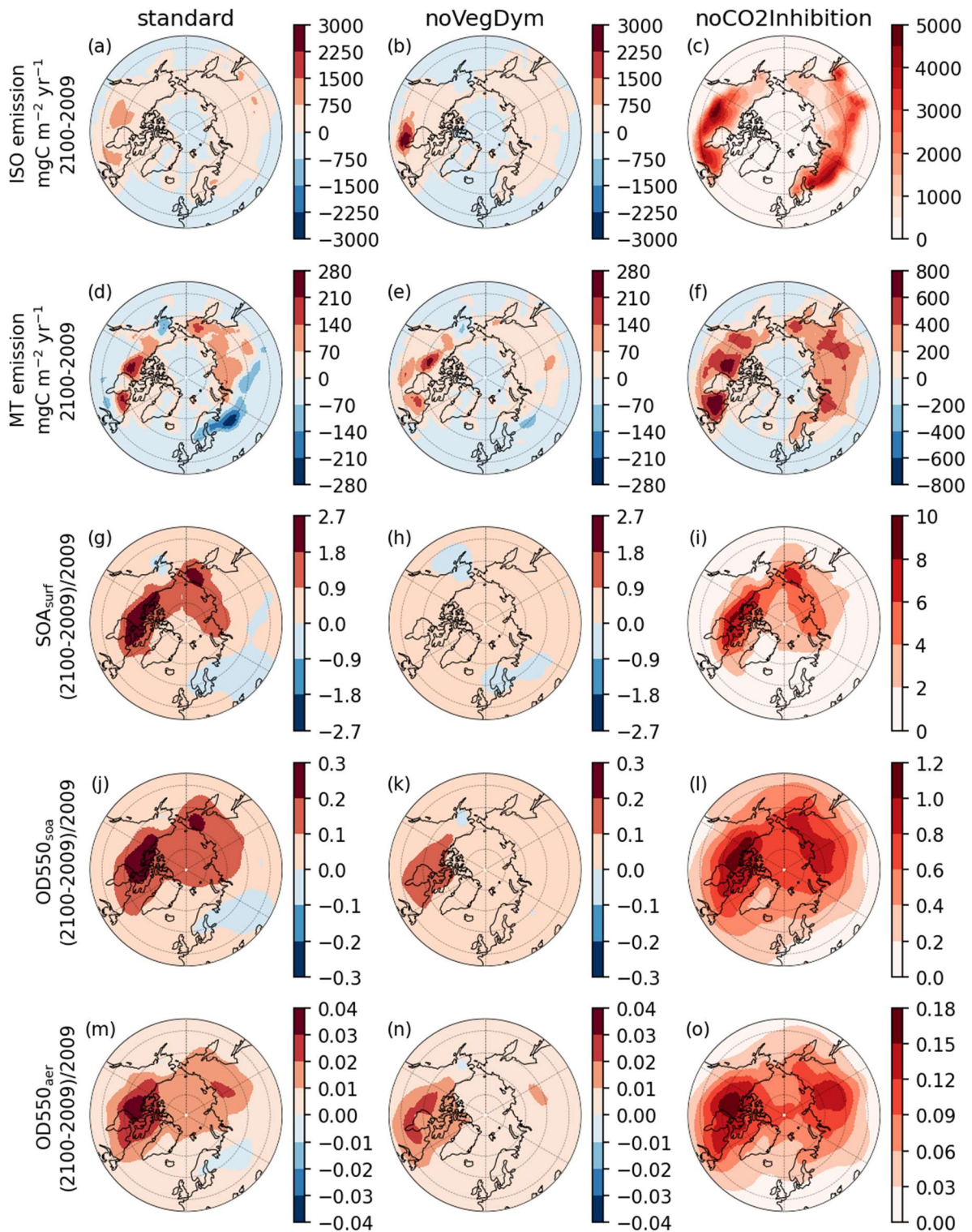
171 warmest scenario (i.e., CanESM5 SSP585), the widespread replacement of boreal needle-leaved trees with
172 broad-leaved deciduous trees (Fig. 2e) in Sweden and Finland clearly contributes to the reduction of SOA_{surf} and
173 optical depths (Fig. 5 g, j, m). When future CO₂ inhibition of BVOC production is excluded, TM5 estimates up
174 to 10-fold increases of SOA_{surf} (mainly in the high latitudes), up to a 1.2-fold increase of OD550_{SOA}, and up to an
175 18% increase in OD550_{acr} in the year 2100 as compared to 2009 under CanESM5 SSP585. Similar patterns but
176 with slightly smaller magnitudes are observed when CO₂ inhibition is only excluded for monoterpenes (data not
177 shown). Under SSP119, the effects of atmospheric CO₂ on regional SOA and aerosols via BVOCs are limited.
178 Our results emphasizes the importance of monoterpenes in influencing SOA and aerosol yields²⁸, and shows that
179 we need to understand whether CO₂ inhibition affects monoterpene production in high latitude plants similarly to
180 those studied plants^{6,7,29}.

181 The simulated changes in BVOCs and SOA lead to increases of CCN concentration at supersaturation of 1%
182 near the surface mainly for the Arctic region (Extended Data Fig. 7), which indicates potential enhanced
183 formation of low-level clouds. For example, without CO₂ inhibition under CanESM5 SSP585, CCN over
184 Greenland and eastern Canada increases by 16 % (Extended Data Fig. 7c). The increased cover of low-level
185 clouds can have both warming (re-emitting received longwave radiation from the ground) and cooling (scattering
186 and reflecting shortwave radiation) feedbacks on the climate¹². The net radiative impacts from BVOC changes in
187 high latitudes are not accounted for in TM5 and therefore not evaluated in this study.



189

190 *Figure 4 The inputs to and outputs from TM5 using CanESM5 SSP119. The first and second rows show LPJ-GUESS*
 191 *simulated isoprene (ISO) and monoterpene (MT) emission changes between 2100 and 2009. The emissions from the year*
 192 *2100 are driven by CanESM5 SSP119. The third to the fifth rows show the TM5 simulated ratio in changes to surface SOA*
 193 *concentration (SOA_{surf}); optical depth of SOA at 550 nm ($\text{OD550}_{\text{soa}}$); and optical depth of aerosol at 550 nm ($\text{OD550}_{\text{aer}}$).*
 194 *From left to right, we show the TM5 results fed with BVOC inputs from three LPJ-GUESS runs, which are standard run (the*
 195 *1st column), noVegDym run (the 2nd column) and noCO2Inhibition run (the 3rd column). The colour bars used for these three*
 196 *columns are kept the same for each corresponding output.*



198

199 *Figure 5* The inputs to and outputs from TM5 using CanESM5 SSP585. The first and second rows show LPJ-GUESS
 200 simulated isoprene (ISO) and monoterpene (MT) emission changes between 2100 and 2009. The emissions from the year
 201 2100 are driven by CanESM5 SSP585. The third to the fifth rows show the TM5 simulated ratio in changes to surface SOA
 202 concentration (SOA_{surf}); optical depth of SOA at 550 nm ($OD550_{soa}$); and optical depth of aerosol at 550 nm ($OD550_{aer}$).
 203 From left to right, we show the TM5 results fed with BVOC inputs from three LPJ-GUESS runs, which are standard run (the
 204 1st column), noVegDym run (the 2nd column) and noCO2Inhibition run (the 3rd column). The colour bars used for standard
 205 and noVegDym runs are kept the same for each corresponding output.

206 Discussion and conclusions

207 Our results illustrate that vegetation changes in a warmer climate play a crucial role in shaping future BVOC
208 feedbacks to atmospheric chemistry and climate. Previous assessments of feedbacks between the land surface
209 and the atmosphere in high latitudes that involve vegetation changes have focused on changes in surface
210 albedo^{20,30}, and increases in atmospheric water vapour³¹, but our study clearly demonstrates the strong and
211 regionally diverse feedbacks of vegetation changes on our climate through the BVOC-SOA pathway. The
212 warming-induced and widespread increase of broadleaved deciduous trees at the expense of boreal evergreen
213 needle-leaved trees in the boreal region suppressed the emissions of monoterpenes and thereby SOA formation,
214 causing a regional warming feedback. In the Arctic, the increased abundance of shrubs and the northward
215 advance of boreal needle-leaved trees in northern Canada and Siberia greatly contributed to an increase of
216 surface SOA, resulting in up to 45% increase in SOA optical depth and likely leading to cooling feedback to our
217 climate. Currently, the Arctic features a lack of aerosol particles for cloud formation¹³, and the northward shifts
218 of vegetation bring in a new, important aerosol source: plant-emitted BVOCs. This ‘new’ source of aerosols
219 might enhance cloud formation in this region. During the growing season, the enhanced cloud coverage might
220 lead to cooling feedbacks through scattering shortwave radiation greater than warming feedbacks associated with
221 re-emission of longwave radiation received from the land surface¹³. The overall net feedbacks from the
222 vegetation-BVOC-SOA pathway on our climate need to be comprehensively evaluated considering the negative
223 feedbacks from scattering and cloud formation from SOA, and also the positive feedbacks from increased
224 longwave radiation emitted from low-level clouds¹².

225 Under high CO₂ emission scenarios, the climate warming-induced increase of natural aerosols from plant BVOC
226 emissions is largely constrained by CO₂ inhibition of BVOC (mainly monoterpene) production, which means
227 that future anthropogenic CO₂ increase might provide an indirect positive feedback to the climate through this
228 inhibition. Young et al.³² showed that the inhibition of isoprene production by the future CO₂ increases can, via
229 atmospheric oxidation, increase hydroxyl radical (OH) concentrations, which can decrease the lifetime of
230 methane by 7 months. The potential for strong atmospheric feedbacks associated with plant BVOC responses to
231 the increasing atmospheric CO₂ concentrations make urgent the need for more leaf- and ecosystem-level
232 observations to unveil the mechanisms for the decoupling between photosynthesis and BVOC production under
233 elevated CO₂. Furthermore, it is still unclear whether elevated CO₂ inhibits monoterpene production to the same
234 degree as isoprene production. The empirical function used in LPJ-GUESS to assess the CO₂ impact on
235 terpenoid production²³ was derived from a limited number of observation studies on trees. Whether the BVOC

236 emissions of low-statured Arctic plants respond similarly to CO₂ is unknown. We currently have no published
237 data that enable a quantification of the low-statured plants' BVOC responses to the surrounding CO₂.

238 Because the current TM5 simulation settings neither consider the impacts from future changes in meteorology,
239 nor other surface emissions except isoprene and monoterpenes, the current TM5 setup allows us to single out the
240 'isolated' impacts from plant-emitted isoprene and monoterpenes alone, regardless of interactions with future
241 changes in other factors (see "Model uncertainties" in Extended Data). Future studies should focus on
242 quantification of the synergistic effects of future plant emissions from high latitudes with other anthropogenic
243 and primary aerosol sources in a coupled Earth System Model (such as ³³).

244 Our results show a potentially significant feedback mechanism linking climate change-induced vegetation
245 composition changes, BVOC dynamics and aerosols in the high latitudes. The negative feedback mechanism
246 between the biosphere, aerosols, and climate concluded from observation data¹⁰ cannot be extrapolated into the
247 future without considering climate change-induced vegetation changes and their impacts on emitted compounds.
248 Our study confirms the importance of BVOCs for future atmospheric SOA concentration and optical depths in
249 the high latitudes. It also reveals the overall impacts largely depend on how atmospheric CO₂ concentration
250 influences monoterpene production. The net radiative feedbacks from BVOCs need a comprehensive evaluation
251 in order to assess the balance between aerosol shortwave cooling and aerosol longwave warming feedbacks in
252 the high latitude environment.

253 [Materials and methods](#)

254 [Dynamic vegetation model, LPJ-GUESS](#)

255 We used the latest version of LPJ-GUESS v4.1 with the relevant developments of wetland biogeochemistry and
256 soil physics following^{34,35}. LPJ-GUESS is a dynamic ecosystem model, which simulates vegetation growth,
257 mortality, and competition, as well as soil biogeochemistry¹⁶. The model has been widely used to assess water,
258 nitrogen and carbon fluxes, as well as vegetation dynamics at regional and global scales. Plants are represented
259 as plant functional types (PFTs) with a set of predefined bioclimatic, physiological, life history and phenological
260 parameters that characterize specific plant growing requirements and spatial distribution. For simulations in high
261 latitudes, different levels of shrubs (high, low and prostrate), lichen, moss and wetland PFTs are specified¹⁷.

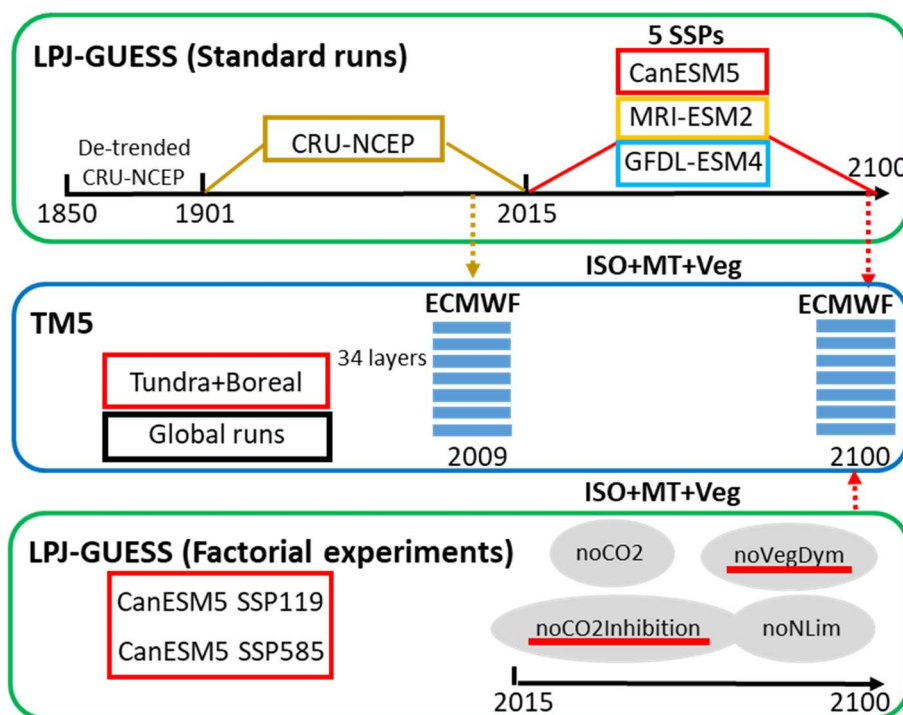
262 Compared with the version of LPJ-GUESS described in Smith et al.,¹⁶, the model version used here includes
263 improved soil temperature calculations, allowing a better representation of soil thawing and freezing processes
264 and influencing water availability to plants. The model also includes wetland biogeochemistry and wetland

265 hydrology³⁶.

266 Daily leaf-level photosynthesis is based on the simplified version of the Farquhar biochemical model^{37,38}, which
267 simulates a gradual transition between an electron-transport-limited and a rubisco-limited carbon assimilation. In
268 the model, a fraction of the photosynthetic electron flux is used to produce isoprene²³ and monoterpenes²⁵, and
269 the production rates of isoprene and monoterpenes are also influenced by PFT-specific emission factors, leaf
270 temperature, seasonality and atmospheric CO₂ concentration. The PFT-specific emission factors (standardized
271 emission rates at photosynthetically active radiation levels of 1000 $\mu\text{mol}/\text{m}^2/\text{s}$ and at a reference temperature of
272 20 °C for Arctic PFTs) in the tundra region are based on the branch- or leaf-level measurement data (see details
273 in^{3,17}), and a stronger temperature sensitivity derived in Tang, et al.¹⁷ has been applied for Arctic PFTs. For
274 boreal and temperate PFTs, the global temperature response curve has been used and the emission factors are
275 based on the reference temperature of 30 °C.

276 Standard runs

277 For simulation of the historical period in this study, we used the monthly CRU-NCEP climate data³⁹ for the
278 period of 1901-2014, and the detrended CRU-NCEP temperature, precipitation and radiation data over 1901-
279 1930 were repeatedly used for the period 1850-1900. For the future period (i.e., 2015-2100), we selected the
280 climate outputs from three general circulation models (GCMs), each following five different Shared
281 Socioeconomic Pathways (SSPs) from the latest CMIP6 project¹⁸ to represent a range of predicted future
282 climates. The three GCMs were selected based on our analysis of temperature changes in the high latitudes, and
283 also on the completeness of the published outputs of these five SSPs (as the dates of access in September 2020)
284 to represent a wide range of future temperature changes in the study region. The monthly climate data from each
285 GCM and SSP for the future period were bias corrected. The biases were calculated as the difference between
286 the monthly climate data of the period 1985-2014 from CRU-NCEP and climate outputs from each scenario in
287 the same period, and these biases were then added to the future climate simulated by the GCM. A detailed
288 description of the bias-correction approach can be found in Ahlström, et al.⁴⁰. The predicted anomalies in future
289 temperature, precipitation, and radiation for the 15 scenarios (3 GCMs x 5 SSPs) are presented in Extended Data
290 Fig. 4. All 15 standard runs share a common climate development during the historical period and start to
291 diverge from 2015 onwards following the different future predictions.



292

293 *Figure 4 Model setup. The modelled monthly isoprene (ISO) and monoterpene (MT) emissions, as well as vegetation status*
 294 *(Veg) from LPJ-GUESS standard and factorial runs were used as inputs for TM5. The year 2009 and 2100 were selected to*
 295 *represent historical and future periods in the global model TM5. ECMWF: European Centre for Medium-Range Weather*
 296 *Forecasts. SSPs: Shared Socioeconomic Pathways (SSPs).*

297

298 Global chemistry transport model, TM5

299 To further assess the impacts of plant-emitted BVOCs on atmospheric aerosols and cloud condensation nuclei
 300 (CCN), the modelled leaf area index and vegetation coverage, together with isoprene and monoterpene emissions
 301 were fed into a global chemistry transport model, TM5-MP⁴¹. TM5-MP is a branch of TM5 with a massively
 302 parallel functionality and is now maintained by KNMI (Royal Netherlands Meteorological Institute). Throughout
 303 the text, we call the model as TM5 for simplicity. The meteorological and surface fields driving the model were
 304 derived from ERA-Interim reanalysis datasets provided by ECMWF (European Centre for Medium-range
 305 Weather Forecasts)⁴², which are the default forcing datasets for TM5. The chemistry scheme used in this study is
 306 a modified version of CB05 (carbon bond mechanism; Yarwood, et al. ⁴³) with more details described in
 307 Williams, et al. ⁴¹. Aerosol processes are calculated with the modal two-moment model M7⁴⁴. It includes seven
 308 log-normally distributed modes comprising four water-soluble modes (nucleation, Aitken, accumulation and
 309 coarse) and three insoluble modes (Aitken, accumulation and coarse). The dry diameter range of each mode is <
 310 10 nm for nucleation mode, 10 nm to 100 nm for Aitken mode, 100 nm to 1000 nm for accumulation mode
 311 and > 1000 nm for coarse mode.

312 Originally in TM5, inputs of monthly mean natural emissions of isoprene and monoterpenes are derived from
313 MEGANv2.1^{14,15}. Then a diurnal cycle is applied to the monthly mean values. However, in this study, we
314 substituted these monthly mean emission data by the emission outputs from individual LPJ-GUESS simulation
315 runs. In all the chemistry simulations, the emission data, vegetation status and vegetation coverage south of the
316 study domain were all set to values from the same standard LPJ-GUESS global run from the year 2009 to ensure
317 that changes to the atmospheric chemistry originate from high-latitude changes only. Furthermore, for the year
318 2100, we used LPJ-GUESS outputs from standard runs of CanESM SSP585 and CanESM SSP119, as well as
319 the outputs from two factorial experiments: noVegDym and noCO2Inhibition, as inputs for TM5. The emissions
320 of isoprene and monoterpenes from biomass burning were applied from the default inventory provided by van
321 Marle, et al.⁴⁵ without diurnal variations. Furthermore, the oceanic dimethylsulfide (DMS) emissions, the
322 mineral dust emissions and the sea salt emissions are calculated within TM5⁴⁶. The other natural emissions such
323 as CO, non-methane VOCs, NO_x (NO+NO₂), NH₃ and SO₂ were prescribed as in van Noije, et al.⁴⁷. The
324 anthropogenic and biomass burning emissions of gases and particles were derived for present-day conditions
325 from the CMIP6 input4MIPs inventory^{45,48}.

326 Once emitted, isoprene and monoterpenes can react with hydroxyl radical (OH) and ozone (O₃) to produce
327 ELVOCs (extreme low volatile organic compounds) and SVOCs (semi-volatile organic compounds), which can
328 condense on particles to increase SOA mass. In addition, ELVOCs can participate in new particle formation
329 together with sulfuric acid. These processes were recently implemented in TM5, which showed better
330 comparison with the observation of aerosol concentration and satellite data of AOD (see Bergman, et al.²⁸ for
331 more details).

332 In this study, a horizontal resolution of 3 degrees in longitude and 2 degrees in latitude was applied. In the
333 vertical direction, 34 hybrid-sigma levels were used. The time step was one hour. All the simulations were run
334 for the year 2009 with a spin-up period of one year. The meteorological and surface fields in 2009 were applied
335 for all the simulation cases, which omitted the meteorological impacts in future scenarios when compared to the
336 present case. Similarly, all the emission datasets applied in all the simulation cases were from the year 2009
337 except those derived from LPJ-GUESS output as mentioned above. TM5 was installed and configured in CSC
338 (Finnish IT Center for Science) Puhti.

339

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