

# Assessing and Projecting Surface Air Temperature Conditions Required To Sustain Permafrost in Japan

Tokuta Yokohata (✉ [yokohata@nies.go.jp](mailto:yokohata@nies.go.jp))

National Institute for Environmental Studies

Go IWAHANA

University of Alaska Fairbanks

Kazuyuki Saito

Japan Agency for Marine-Earth Science and Technology

Noriko Ishizaki

National Institute for Environmental Studies

Taiga Matsushita

University of Tsukuba

Tetsuo Sueyoshi

National Institute for Polar Research

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## Research Article

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2 **Japan**

3  
4 Tokuta Yokohata<sup>a</sup>, yokohata@nies.go.jp

5 Go Iwahana<sup>b</sup>, giwahana@alaska.edu

6 Kazuyuki Saito<sup>c</sup>, ksaito@jamstec.go.jp

7 Noriko Ishizaki<sup>a</sup>, ishizaki.noriko@nies.go.jp

8 Taiga Matsushita<sup>d</sup>, s2121147@s.tsukuba.ac.jp

9 Tetsuo Sueyoshi<sup>e</sup>, sueyoshi.tetsuo@nipr.ac.jp

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11 <sup>a</sup> *National Institute for Environmental Studies, Tsukuba, Japan*

12 <sup>b</sup> *University of Alaska Fairbanks, Alaska, USA*

13 <sup>c</sup> *Japan Agency for Marine-Earth Science and Technology, Yokohama, Japan*

14 <sup>d</sup> *University of Tsukuba, Tsukuba, Japan*

15 <sup>e</sup> *National Institute for Polar Research, Tokyo, Japan*

16  
17 **Abstract**

18 Permafrost covers a wide area of the Northern Hemisphere, including high-altitude mountainous areas  
19 even at mid-low latitudes. There is concern that the thawing of mountain permafrost can cause slope  
20 instability and substantially impact alpine ecosystems. However, permafrost in mountainous areas is  
21 difficult to observe, and detailed analyses have not been performed on its current distribution and  
22 future changes. Here, we show that the surface air temperature required to sustain Japan's mountain  
23 permafrost is estimated to decrease rapidly at present; most mountain permafrost in Japan is projected  
24 to disappear by the second half of the 21st century, and disappear very quickly in some places from  
25 approximately 2020–2030, regardless of climate scenarios. Our projections indicate that climate  
26 change has a considerable impact on mountain environments and that even if climate stabilization is  
27 achieved, Japan's mountain permafrost may almost disappear. It is important to consider measures to  
28 adapt to the changing mountain environment.

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31 **Main**

32 The ground where the temperature falls below 0°C for two consecutive years is called permafrost<sup>1</sup>.  
33 Thawing of permafrost in mountainous areas has reportedly increased the frequency and scale of  
34 rockfalls and landslides<sup>2-4</sup>. This increase in disasters in mountainous areas threatens the safety of hikers  
35 and mountaineers<sup>5</sup> and changes iconic mountaineering routes and suitable climbing seasons<sup>6</sup>. In  
36 addition, the thawing of permafrost has a substantial impact on alpine ecosystems through changes in  
37 temperature, soil moisture and groundwater<sup>7</sup>. The disappearance of permafrost, coupled with  
38 inadequate precipitation in summer and reduced snowmelt, can cause a lack of water during the  
39 growing season, early peak times, changes in species compositions, and reduced greening and  
40 productivity<sup>8,9</sup>. Thawing of mountain permafrost can have great impacts on mountain ecosystems,  
41 including various kinds of alpine plants and animals<sup>10</sup>, which are valuable natural resources visited by  
42 many climbers<sup>11</sup>.

43 Studies on future projections of permafrost thawing show that thawing proceeds from lower latitudes  
44 and warmer regions<sup>12</sup>. Therefore, it is very important to estimate the current state and future projection  
45 of permafrost located at the lower limit latitude of the permafrost distribution to understand the  
46 changes in permafrost due to climate change. According to a study of global permafrost distribution<sup>13</sup>,  
47 the lowest latitude permafrost in the Northern Hemisphere is located on the Tibetan Plateau (28°N).  
48 In Asia, Japan's mountainous areas (Mt. Fuji: 35°N, Mt. Tateyama: 37°N, and the Daisetsu Mountains:  
49 43°N), the Tianshan Mountains in China (42°N), and the Daxing Anling Mountains (50°N) reportedly  
50 contain permafrost<sup>13</sup>. Among these areas, estimates of permafrost distribution at the 1-km scale have  
51 been compared with observational data for the Tibetan Plateau and mountains in China<sup>13</sup>. On the other  
52 hand, regarding Japan's mountain permafrost, permafrost has been reported in the Daisetsu  
53 Mountains<sup>14,28-31</sup>, Mt. Fuji<sup>15,16</sup>, and Mt. Tateyama<sup>17,18</sup> in the Northern Japan Alps, but country-scale  
54 analyses have not been performed to date.

55 Future projections of permafrost distribution have been estimated using global climate models  
56 (GCMs)<sup>19-22</sup>. However, since the resolution of GCMs is approximately 100 km in general, it is difficult  
57 to estimate the current distribution and future projection of mountain permafrost, which involves  
58 detailed altitude distributions<sup>23</sup>. In a previous study, we used bias-corrected and 1-km downscaled  
59 GCM projections<sup>24</sup> to assess the size of the areas where climate conditions are suitable for permafrost  
60 in Japan's Daisetsu Mountains<sup>25</sup>. In this study, the areas with climatic conditions suitable for sustaining  
61 permafrost in all of Japan were estimated by using the method from our previous study<sup>25</sup>.

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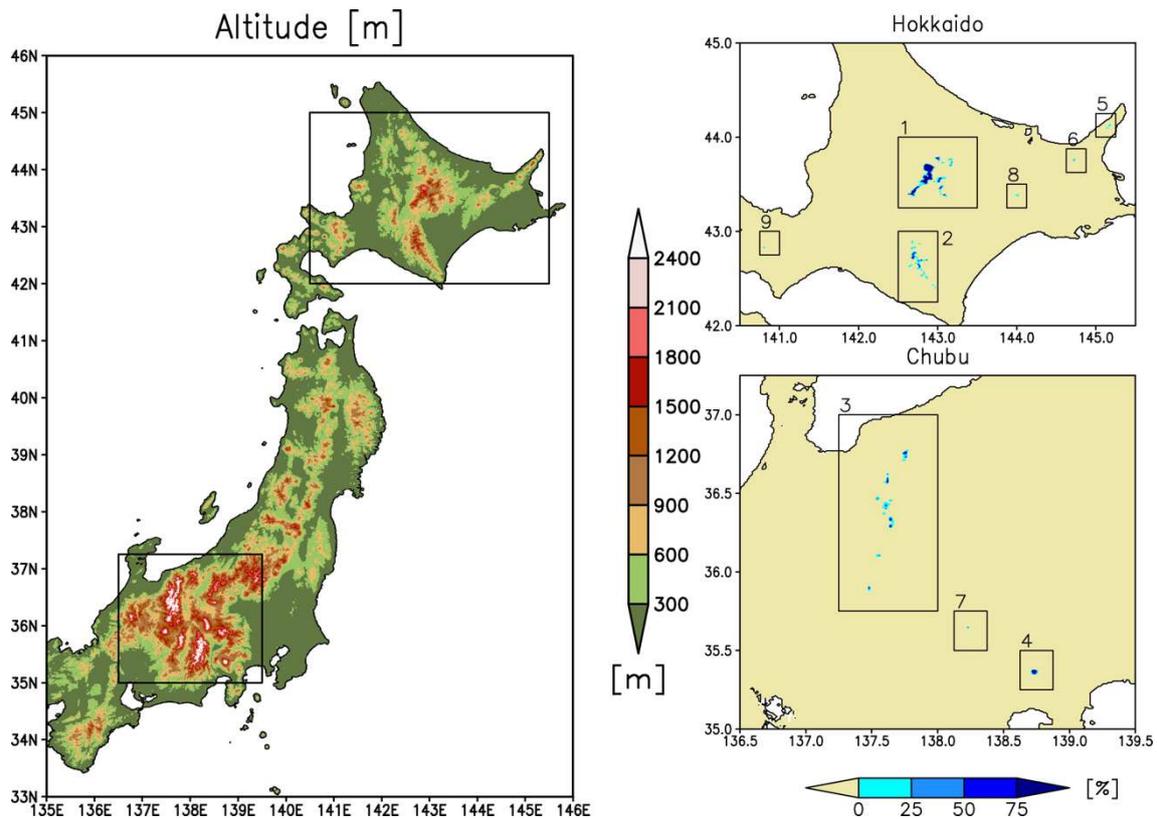
64 **Assessing surface air temperature conditions to sustain permafrost in Japan**

65 Figure 1 (left) shows the altitude distribution of eastern Japan. In general, the annual mean surface air  
66 temperature is low at high latitudes and high altitudes. The correspondence between altitude and  
67 annual mean surface air temperature is shown in Figure S1. In eastern Japan, the regions with low  
68 surface air temperatures are on Hokkaido (the northern island in Japan). As shown in Figure 1 left,  
69 high-altitude mountains exist in the inland (Daisetsu Mountains, 1 in Figure 1 right), southern central  
70 (Hidaka Mountains, 2 in Figure 1 right), and eastern areas (5, 6, and 8 in Figure 1 right) on Hokkaido.  
71 On the main island on the south side of Hokkaido, there are particularly high mountains in the central  
72 region, called Chubu (southern square in Figure 1 left), due to the influence of orogeny. In the Chubu  
73 region, the high mountainous areas are the Northern Japan Alps (3 in Figure 1 right), the Southern  
74 Alps (7 in Figure 1 right), and Mt. Fuji (4 in Figure 1 right).

75 Figure 1 (right) shows an area with climatic conditions that are suitable for permafrost development  
76 in the mountainous region of Japan. These areas are probable locations of permafrost based on nine  
77 bias-corrected and downscaled climate scenarios<sup>24,26</sup> in each grid. Permafrost classification in this  
78 study is based on Saito et al.<sup>27</sup>, which classified permafrost into two types (i.e., climate-driven  
79 permafrost (CDP) and environmentally conditioned permafrost (ECP); see details in the Methods  
80 section); however, only ECP is present in the mountainous region of Japan. Given that the actual  
81 distribution of permafrost is determined by complex interactions between environmental phenomena,  
82 such as topography and geology<sup>14</sup>, the grid cells classified as permafrost in this study indicate only  
83 where the climatic conditions are suitable for the maintenance of permafrost. We refer to areas  
84 containing these grid cells as the “ECP region”. In addition to surface air temperature, snow cover is  
85 an important factor affecting the distribution of permafrost<sup>14</sup>. In general, permafrost is distributed in  
86 wind-blown gravel areas where the snow cover is typically thin. Due to the limited distribution of  
87 wind-blown gravel areas, the actual distribution of permafrost would be smaller than the area estimated  
88 using only surface air temperatures<sup>25</sup>.

89 The ECP regions obtained by this study, in descending order by area under the current climate, are  
90 1) the Daisetsu Mountains, 2) the Hidaka Mountains, 3) the Northern Japan Alps, 4) Mt. Fuji, 5) Mt.  
91 Shiretokodake, 6) Mt. Sharidake, 7) the Southern Japan Alps, 8) Mt. Akandake, and 9) Mt. Yotei. In  
92 general, the ECP region is located in high-latitude and high-altitude mountainous regions where the  
93 surface air temperature is low throughout the year.

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97 **Figure 1.** Left) The altitude distribution of the eastern Japan region [m], and right) the distribution of  
 98 the surface air temperature environment that maintains permafrost in the mountainous regions of  
 99 Japan, upper right) Hokkaido, and lower right) the Chubu region. The numbers indicate 1) Daisetsu  
 100 Mountains, 2) Hidaka Mountains, 3) Northern Japan Alps, 4) Mt. Fuji, 5) Mt. Shiretokodake, 6) Mt.  
 101 Shari, 7) Southern Japan Alps, 8) Mt. Akandake, and 9) Mt. Yotei. The surface air temperature  
 102 environment is derived based on the probability determined based on nine bias-corrected climate  
 103 scenarios. The Grid Analysis and Display System (GrADS, <http://cola.gmu.edu/grads/>) is used to  
 104 plot this figure.

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107 Figure 2 shows the details of the ECP region in the nine areas. Regions with high confidence in  
 108 multimodel estimations (large value in Figure 2) are 1) the Daisetsu Mountains, 2) the Hidaka  
 109 Mountains, 3) the Northern Japan Alps, and 4) Mt. Fuji. In Figure 2, the points where permafrost  
 110 was confirmed by previous observational studies are shown in red (the details of the observational  
 111 sites are shown in Supplementary Table S1). Permafrost has been observed in the Daisetsu  
 112 Mountains<sup>14,28-31</sup>, Northern Japan Alps<sup>17</sup>, and on Mt. Fuji<sup>16</sup>, which is consistent with the findings of  
 113 the present study, as shown in Figure 2. The ECP region exists at altitudes higher than 1600 m in the  
 114 Daisetsu and Hidaka Mountains on Hokkaido. Permafrost has not been observed in the Hidaka

115 Mountains to date, but our results indicate that permafrost can exist at altitudes higher than 1600 m  
116 in the Hidaka Mountains. Permafrost has been observed in Tateyama in the Northern Japan Alps<sup>17,18</sup>,  
117 but permafrost can exist in other mountains at altitudes above 2600 m. Mt. Fuji is located at a lower  
118 latitude than other areas, but the area above 3000 m is identified as the ECP region, which is  
119 consistent with previous studies<sup>16</sup>. We also confirmed that the annual mean surface air temperature at  
120 the field observation sites in these mountains is consistent with the observational data, as shown in  
121 Supplementary Figure S2.

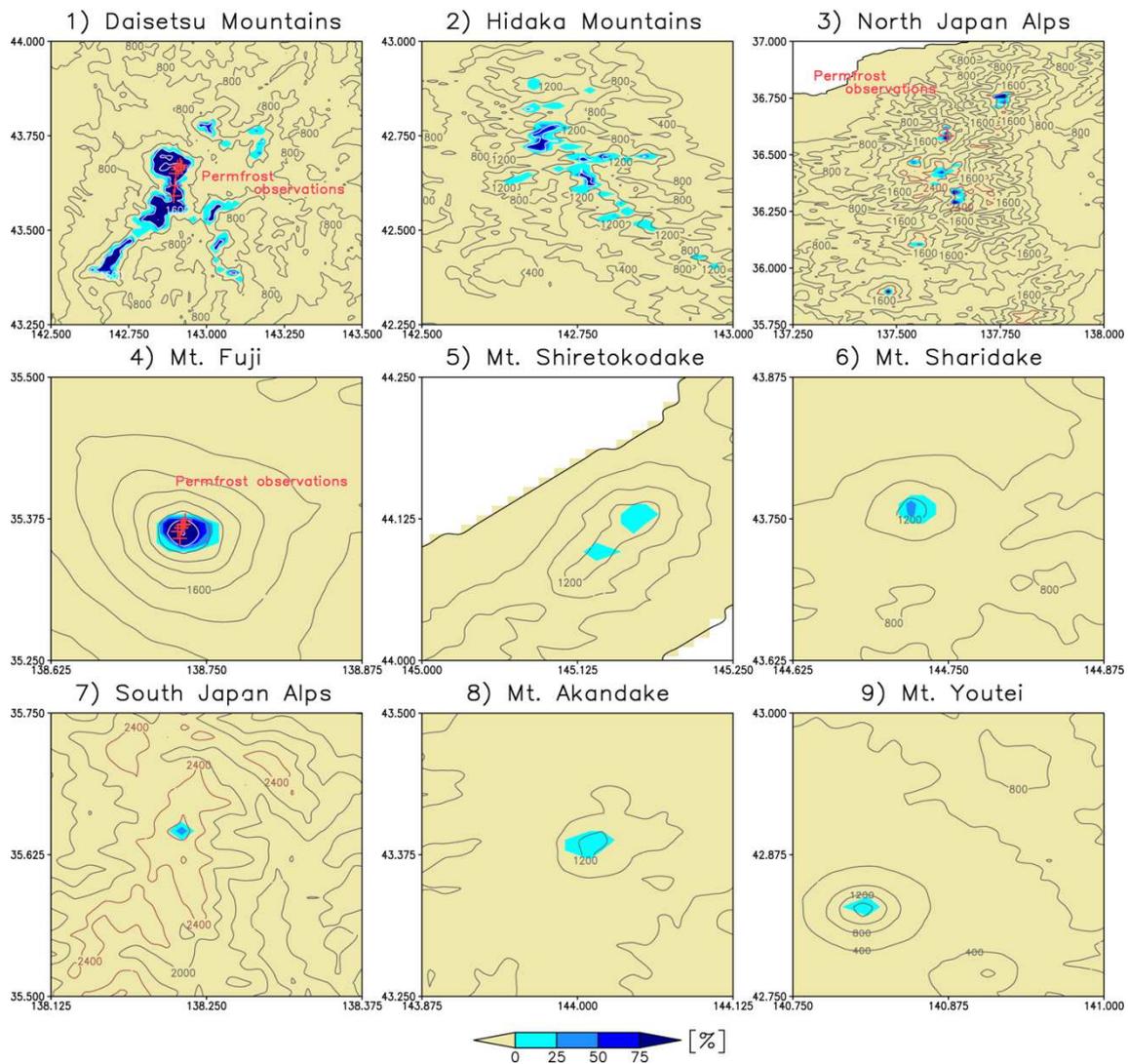
122 Regions with low confidence in projections from multiple bias-corrected and downscaled GCMs  
123 are 5) Mt. Shiretokodake, 6) Mt. Sharidake, 7) the Southern Japan Alps, 8) Mt. Akandake, and 9) Mt.  
124 Yotei (Figure 2). In these domains, ECP regions exist at altitudes above 1400 m (Mt. Shiretokodake),  
125 1200 m (Mt. Sharidake), 3000 m (Southern Japan Alps), 1300 m (Mt. Akandake), and 1800 m (Mt.  
126 Yotei).

127 Latitude and altitude are important geographical factors that determine the surface air temperature  
128 and thus the distribution of permafrost. Figure 3 shows a scatter plot of the latitude-altitude distribution  
129 in the ECP regions under the present climate. In Figure 3, the regression line is calculated by selecting  
130 the points corresponding to the lowest altitude at each latitude. Thus, the lower limit altitude of the  
131 ECP region in the mountainous region of Japan in the present climate is

$$132 \text{Altitude} = 2997 - (\text{latitude} - 35) \times 177 \text{ [m]} \quad (1)$$

133 The lower limit altitude is approximately 2997 m at latitude 35°N, and the lower limit altitude  
134 decreases by 177 m as the latitude increases by 1°.

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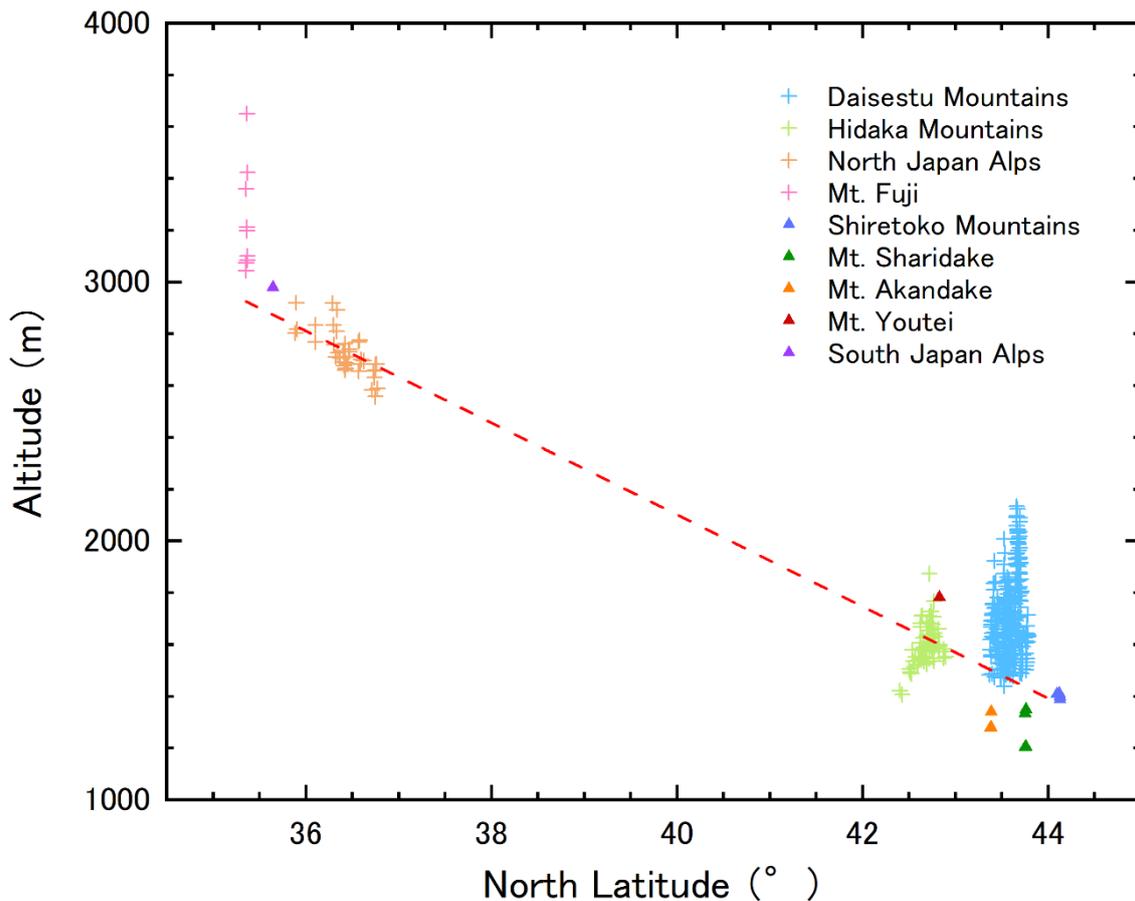
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**Figure 2.** Distribution of the surface air temperature environment that maintains permafrost in the mountainous regions of Japan under the current climate (averaged over 1999–2018). 1) Daisetsu Mountains, 2) Hidaka Mountains, 3) Northern Japan Alps, 4) Mt. Fuji, 5) Mt. Shiretokodake, 6) Mt. Shari, 7) Southern Japan Alps, 8) Mt. Akandake, and 9) Mt. Yotei. The environmentally conditioned permafrost (ECP) region is derived based on the probability determined based on nine bias-corrected climate scenarios. Red points indicate places where permafrost has been observed (see Supplementary Table S1). The Grid Analysis and Display System (GrADS, <http://cola.gmu.edu/grads/>) is used to plot this figure.



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150 **Figure 3.** Latitude-altitude distribution of the surface air temperature environment that maintains  
151 permafrost. The colours or shapes differ for each of the nine regions shown in Figure 1. The red line  
152 is a regression line calculated using the points that take the lowest altitude at each latitude.

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### 155 **Projecting surface air temperature conditions to sustain permafrost in Japan**

156 Figure 4 shows the time series of the area of ECP regions in Japan. Similar to Figure 2, Figure 4 shows  
157 the results of the nine domains in order from the one with the largest ECP region under the current  
158 climate. In the Daisetsu Mountains, which have the largest ECP region in Japan, the results are similar  
159 to those of our previous study<sup>25</sup>. ECP regions decrease from approximately 2000 because the surface  
160 air temperature at high latitudes rises sharply from this period in the GCM projections (Figure 7 in  
161 Yokohata et al.<sup>25</sup>). In the Daisetsu Mountains, the area of the ECP region was approximately 150 km<sup>2</sup>  
162 in 2010, but the average value of multimodel projections shows that the ECP region disappears in  
163 approximately 2070 under RCP8.5. In 2100, the ECP region is projected to decrease to 20 km<sup>2</sup> in the  
164 RCP2.6 scenario and 10 km<sup>2</sup> in the RCP4.5 scenario. In the Hidaka Mountains and Northern Japan  
165 Alps, the time series of the future projection of the ECP region area are similar (Figure 4). The areas

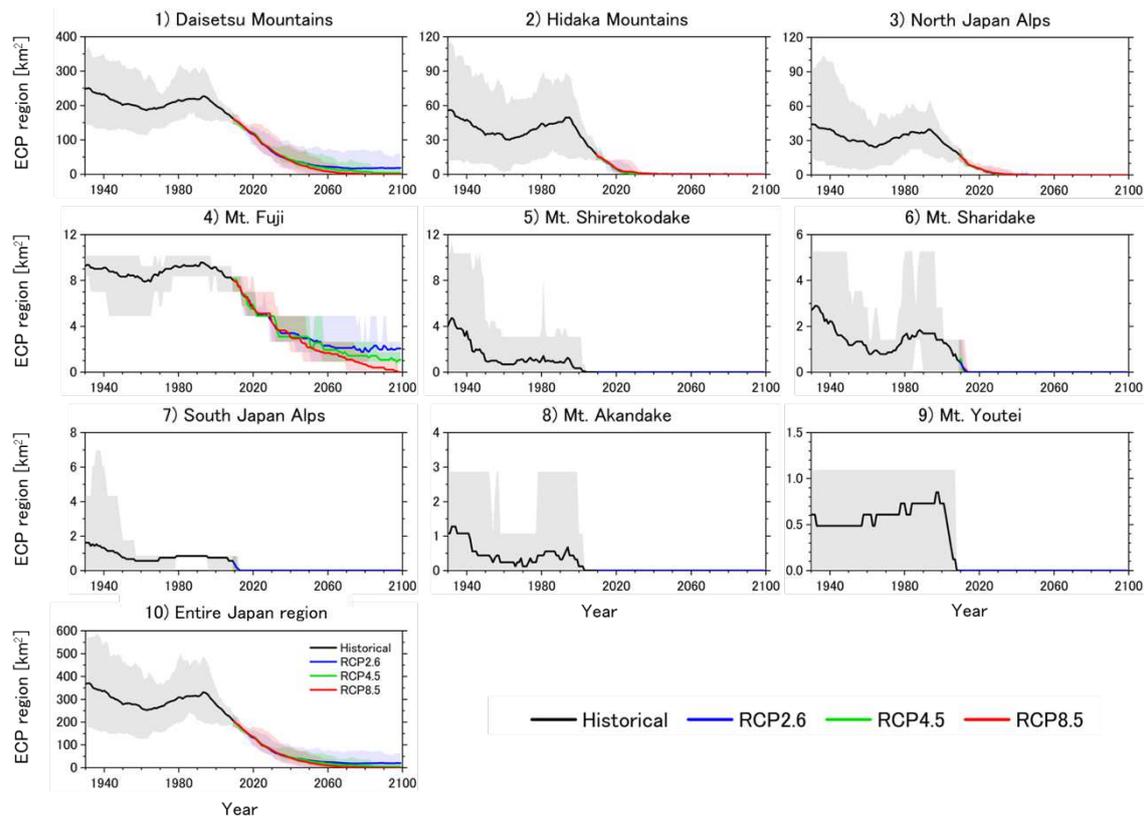
166 of the ECP region peaked in approximately 2000, after which the ECP region decreased sharply. In  
167 the Hidaka Mountains and Northern Japan Alps, the differences among climate scenarios are very  
168 small, and in all scenarios, the ECP regions are projected to disappear by approximately 2030. The  
169 reason why the ECP regions of the Hidaka Mountains and Northern Japan Alps are projected to  
170 disappear in the near future is that the elevations of these mountains are close to the lower limit of the  
171 ECP region under the current climate (Figure 3). The ECP regions are easily lost in the Hidaka  
172 Mountains and Northern Japan Alps due to the rapid increase in surface temperature in the high-  
173 latitude regions, which has progressed since the 2000s (Figure 7 in Yokohata et al.<sup>25</sup>).

174 Compared with other regions, Mt. Fuji has a relatively small change in the area of its ECP region  
175 (Figure 4) because there is a large difference between the mountaintop altitude and the lower limit  
176 altitude of the ECP region under the current climate (Figure 3). Nevertheless, the ECP region on Mt.  
177 Fuji is projected to disappear completely by 2100 in the RCP8.5 scenario. The ECP region on Mt. Fuji  
178 as of 2010 was approximately 8 km<sup>2</sup>, and it is projected to be approximately 1 km<sup>2</sup> in the RCP4.5  
179 scenario and approximately 2 km<sup>2</sup> in the RCP2.6 scenario in 2100. Even if climate stabilization is  
180 achieved in the RCP2.6 and RCP4.5 scenarios, it is projected that the Mt. Fuji ECP region will nearly  
181 disappear by the end of the 21<sup>st</sup> century.

182 In the five domains with low concordance of multimodel projections for ECP regions under the  
183 current climate (20% or less), including 5) Mt. Shiretoko, 6) Mt. Shari, 7) the Southern Alps, 8) Mt.  
184 Akan, and 9) Mt. Yotei, the ECP regions are projected to decrease rapidly beginning in the 2000s  
185 (Figure 4). In these domains, the ECP region is projected to disappear rapidly because the lower limit  
186 altitude of the ECP region in the current climate is close to the mountain altitude, as shown in Figure  
187 3, and because the areas of the ECP region in the current climate are small (approximately 1–4 grids,  
188 where 1 grid is approximately 1 km<sup>2</sup>).

189 The time series of the area of ECP regions in all of Japan is shown in Figure 4. Compared with the  
190 future projections for the Daisetsu Mountains shown in our previous study<sup>25</sup>, the projected decrease in  
191 the ECP region throughout Japan is more rapid because the altitudes of many mountains other than  
192 the Daisetsu Mountains and Mt. Fuji are close to the lower limit altitudes of the ECP region under the  
193 current climate, and the ECP region disappears due to a slight temperature increase.

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196

197 **Figure 4.** Time sequence of the surface air temperature environment area that maintains permafrost in  
 198 the mountainous regions of Japan. 1) Daisetsu Mountains, 2) Hidaka Mountains, 3) Northern Japan  
 199 Alps, 4) Mt. Fuji, 5) Mt. Shiretokodake, 6) Mt. Shari, 7) Southern Japan Alps, 8) Mt. Akandake, 9)  
 200 Mt. Yotei, and 10) all of Japan. Historical simulations (black) and future projections of the RCP2.6  
 201 (blue), RCP4.5 (green), and RCP8.5 (red) scenarios are shown. The shading indicates the minimum  
 202 and maximum of multimodel projections, and the thick line shows the multimodel average.

203

204

## 205 **Conclusions**

206 In previous studies, the existence of permafrost was reported only in the Daisetsu Mountains<sup>14,28-31</sup>,  
 207 Mt. Fuji<sup>15,16</sup>, and Mt. Tateyama<sup>17,18</sup> in the Northern Japan Alps of Japan, but this study shows that  
 208 permafrost can exist in other regions, such as the Hidaka Mountains, Mt. Shiretokodake, Mt. Sharidake,  
 209 the Southern Japan Alps, Mt. Akandake, and Mt. Yotei (Figure 2). Our results will aid in the selection  
 210 of candidate sites for mountain permafrost observations in Japan. If permafrost exists in these regions,  
 211 then monitoring changes in permafrost is an important future task.

212 Furthermore, for the first time, this study shows future projections of the surface air temperature  
 213 environment that maintains permafrost (called the ECP region) throughout Japan. We project that most  
 214 of the ECP region in Japan will disappear by the second half of the 21st century, regardless of climatic

215 scenarios (Figure 4). The temperature environment that maintains permafrost currently exists in nine  
216 domains (Figure 2), but it is projected that even in the RCP2.6 scenario, which stabilizes the global  
217 average temperature at an increase of approximately 2 °C, the ECP regions can exist only at altitudes  
218 higher than 1900 m in the Daisetsu Mountains and higher than 3200 m on Mt. Fuji in 2100 (Figure  
219 S3). Our results indicate that climate change is already having a tremendous impact on Japan's  
220 mountain environment and that even if climate stabilization can be achieved, mountain permafrost is  
221 projected to largely disappear.

222 Notably, the analysis presented in this study does not consider detailed factors, such as topography  
223 (slope direction and slope angle), soil properties (porosity and permeability), and meteorological  
224 conditions (precipitation, local wind direction and snow cover), which are known to play important  
225 roles in determining the distribution of permafrost<sup>14,16-18,28</sup>. Using a 30-year average as the  
226 calculation period for the freezing and thawing indices, hysteresis in surface air temperature changes  
227 is considered in our estimates for the ECP region (see Methods). However, the response of  
228 permafrost to changes in climatic conditions may occur over a much longer time scale<sup>27</sup>, and  
229 changes in permafrost distributions may be slower than those shown in Figure 4. Nonetheless, the  
230 extent of permafrost in Japan's mountainous areas is projected to decrease significantly due to future  
231 rises in temperature.

232 The climatic conditions under which permafrost can exist in Japan's mountainous regions are  
233 projected to shift towards conditions where permafrost will disappear, regardless of the climate  
234 scenario (RCP2.6, RCP4.5, and RCP8.5), indicating the importance of monitoring the environment  
235 and developing adaptation measures for climate change. Specifically, it is important to monitor the  
236 phenology and distribution of alpine vegetation to investigate the effects of permafrost thawing on  
237 alpine ecosystems<sup>25</sup>. Accurately monitoring environmental changes in mountainous areas is also vital  
238 to address the problem of increases in the scale and frequency of flow slopes and landslides<sup>2,4</sup>. Thus,  
239 applying a technique to understand the ground-surface displacement in detail by using satellite data  
240 is effective<sup>32,33</sup>. In addition to accurately monitoring changes in mountain environments, providing  
241 local governments with appropriate measures to prepare for major future environmental changes is  
242 an essential issue for future studies.

243

## 244 **Methods**

### 245 **Bias-corrected and downscaled climate model output**

246 In this study, we used bias-corrected and downscaled climate model outputs developed by Ishizaki et  
247 al.<sup>24,26</sup>, who generated two bias-corrected climate scenarios using different methods. We used  
248 climate scenarios based on the cumulative distribution function-based downscaling method  
249 (CDFDM, developed in previous studies<sup>34-36</sup>). Using the CDFDM, the cumulative distribution  
250 function for simulated daily mean data is corrected so that it matches the 1-km resolution

251 meteorological data for Japan<sup>37</sup>. Ishizaki et al.<sup>24</sup> demonstrated that CDFM is superior to other  
252 methods, such as Gaussian-type scaling approaches<sup>38</sup>. Furthermore, Ishizaki et al.<sup>24,26</sup> corrected  
253 biases in historical simulations and future projections based on the RCP2.6 and RCP8.5 scenarios for  
254 four CMIP5 GCMs (GFDL-CM3<sup>39</sup>, MIROC5<sup>40</sup>, HadGEM2-ES<sup>41</sup>, MRI-CGCM3<sup>42</sup>, Nor-ESM<sup>43</sup>) and  
255 the RCP2.6, RCP4.5, and RCP8.5 scenarios for five CMIP6 GCMs (MIROC6<sup>44</sup>, MRI-ESM2-0<sup>45</sup>,  
256 ACCESS-CM2<sup>46</sup>, IPSL-CM6A-LR<sup>47</sup>, MPI-ESM1-2-HR<sup>48</sup>) for the Japan region at a resolution of 1  
257 km. Briefly, the reasons why Ishizaki et al.<sup>24,26</sup> selected nine GCMs from the CMIP5 and CMIP6  
258 GCMs were to cover the uncertainty ranges of future surface air temperature and precipitation  
259 projections with the models and to utilize their reproducibility in the 20th century climate.

260 Ishizaki et al.<sup>24</sup> showed that bias-corrected historical climate scenarios accurately reproduced  
261 monthly averaged values; extreme values, such as summer days; and indicators defined by daily  
262 values, such as precipitation intensity. In this study, we utilized version 202005 for CMIP5<sup>Ishizaki2020</sup>  
263 and version 202105 for CMIP6<sup>26</sup>, in which the time window for the cumulative distribution function  
264 (one month) and the reference period (1980–2018) were modified so that the monthly values  
265 corresponded to those of the observations.

266

#### 267 **Statistical method for inferring permafrost distribution**

268 The freezing (thawing) index, defined as the cumulative daily temperature below (above) the freezing  
269 point of 0°C, has been used as a proxy for inferring permafrost distribution. Saito et al.<sup>27</sup> used this  
270 index to develop a high-resolution (2 km) method to estimate the permafrost distribution in  
271 northeastern Asia, including the permafrost in Japanese mountainous areas investigated in the present  
272 study. Therefore, we employed the same method to infer the permafrost distribution using bias-  
273 corrected, 1-km resolution climate scenarios developed by Ishizaki et al.<sup>24</sup>.

274 Saito et al.<sup>27</sup> classified the permafrost area in northeastern Asia into two categories based on  
275 freezing and thawing indices: (a) CDP, which are areas where climatic conditions favour the  
276 development and/or maintenance of continuous permafrost; and (b) ECP, which are areas where the  
277 presence of permafrost is conditional upon environmental factors, such as ecosystem characteristics,  
278 topography or geology. In addition, Saito et al.<sup>27</sup> divided seasonally frozen ground into two  
279 subcategories: (c) ground that undergoes seasonal freezing (SF) and (d) ground that undergoes  
280 intermittent freezing (IF). These distinctions were made to distinguish between seasonal frost that is  
281 deep and/or persistent and frost that exists for a short time, i.e., less than two weeks.

282 Using a freezing index, i.e., the number of days per year when the surface air temperature is below  
283 0°C multiplied by the surface air temperature,  $I_f$ , and the thawing index, i.e., the number of days per  
284 year when the surface temperature is above 0°C multiplied by the surface air temperature, the  
285 definition of permafrost classification is described as follows.

286 (a) Climate-driven permafrost: CDP

287 
$$I_t < 0.9 I_f - 2300 \quad (1)$$

288 (b) Environmentally conditioned permafrost: ECP

289 
$$0.9 I_f - 2300 < I_t < 2.4 I_f - 3300 \quad (2)$$

290 (c) Seasonal freezing: SF

291 
$$2.4 I_f - 3300 < I_t \text{ and } 30 < I_f \quad (3)$$

292 (d) Intermittent freezing: IF

293 
$$0 < I_f \leq 30 \quad (4)$$

294 For consistency with Saito et al.<sup>27</sup>, this study uses the monthly mean surface air temperature to  
295 calculate the freezing and thawing indices. Previous studies have shown that the relative error is less  
296 than 5% when using daily or monthly means<sup>49</sup>. Saito et al.<sup>27</sup> performed a permafrost classification at  
297 a resolution of 2 km by considering the temperature decrease with altitude using spatially detailed  
298 elevation data (ETOPO1<sup>50</sup>) based on the results of the CMIP5 GCMs. In the present study, a  
299 temperature decrease with altitude was considered in the 1-km mesh observational data<sup>37</sup> used for  
300 bias-corrected climate scenarios<sup>24,26</sup>.

301 In this study, the freezing and thawing indices for the past 30 years were averaged to classify the  
302 permafrost in each grid, similar to Saito et al.<sup>27</sup>. Averaging over 30 years smooths the internal  
303 variability in surface air temperature and corresponds to the delayed response of permafrost to  
304 climate change.

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