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1 **Increased Water Risks to Global Hydropower in 1.5°C and 2.0°C warmer worlds**

2

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20 **Abstract**

21 Hydropower plays an important role within the renewable energy sector and supports the  
22 achievement of international energy security targets. Yet this sector is also vulnerable to  
23 droughts which affect generation potential, and high flows which can cause structural and  
24 operational damage. Here we use river flows calculated using a multi-model ensemble to  
25 investigate the potential water risks which current and planned global hydropower  
26 generation capacities may face at 1.5°C and 2.0°C warmer worlds. We find that the global  
27 hydropower sector will have to face diverse, simultaneous, and compound water risks.  
28 We estimate that about 65% of current global hydropower installed capacity will be  
29 exposed to risk from recurrent high river flows (here understood as the change in the 1-  
30 in-100-years flow). Up to 75% of existing hydropower capacity in Europe, North America  
31 and MENA is located in areas where droughts are projected to become at least 10% longer  
32 when compared to historical conditions. Achieving a 1.5°C warming target would reduce  
33 these risks, compared to a 2.0°C scenario.

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40 **Key words: Climate change, Paris agreement, Floods, Droughts, Hydropower**

41 **1. Introduction**

42 The hydropower sector contributed to approximately 15% of global electricity generation  
43 in 2019, supplying over 70% of global renewable energy (IEA, 2019). In that year, annual  
44 hydropower production was approximately 4,306 TWh (Bartle, 2016; IHA, 2020). By  
45 2040 the energy output from hydropower sources is projected to reach about 7,000  
46 TWh/year. This figure is expected to be reached by maintaining the current growth in  
47 installed capacity (about 15-25 GW/year) through rapid expansion in the developing  
48 world (Hoes et al., 2017; IEA, 2019).

49 Maintaining a reliable hydropower sector is important not just for country-level energy  
50 security interests but also to assist regional and global development ambitions (Dincer,  
51 2000; Güney, 2019). Although hydropower expansion is both politically and  
52 environmentally controversial, sectoral estimates suggest that hydropower outputs need  
53 to be maintained at an average yearly increase of 2.5% in order to support the achievement  
54 of Sustainable Development Goals by 2030 (IEA 2019). Also, while about 10% of the  
55 world's hydropower facilities, especially in tropical areas, may emit as much greenhouse  
56 gases as conventional coal-fired power plants, hydroelectricity is still considered a low-  
57 carbon source of renewable energy (Demarty and Bastien, 2011; Edenhofer et al., 2014;  
58 Scherer and Pfister, 2016). Indeed, estimates suggest that emissions from most global  
59 hydropower projects are within the range of other renewable energies, especially when  
60 they are adequately planned, built, and operated (Almeida et al., 2019). At the same time,  
61 the high ramp rate of hydropower plants can serve to balance the variability and potential  
62 shortages in wind and solar generation. Thus the hydropower sector may support reliable  
63 integration of other renewable energies into supply grids (Berga, 2016; Dujardin et al.,  
64 2017; Graabak et al., 2019; Muller, 2019).

65

66 Acknowledging these opportunities (as well as limitations), the hydropower sector may  
67 also help achievement international climate goals. In particular, the Paris Agreement,  
68 apart from “limiting the increase in global average temperature to well below 2°C above  
69 pre-industrial levels, and to pursue efforts to limit the temperature increase to 1.5°C above  
70 pre-industrial levels” (Christoff, 2016) also requires the promotion of sustainable energy  
71 sources as sources of mitigation and adaptation policies.

72

73 Yet, hydropower dam sites, and their expected benefits are vulnerable to various types of  
74 water risks. These risks are mainly connected to changes in the variability of seasonal  
75 hydrological conditions, low flows resulting in droughts, and the occurrence of high flows  
76 and floods (Blomfield and Plummer, 2014). This vulnerability has been evident in recent  
77 years as increases in hydropower production have been small or even negative in the  
78 period 2006-2008 and 2015-2017 (IEA, 2019). For instance, in 2017, severe drought in  
79 Brazil reduced the country’s yearly outputs by approximately 5% (Brazil alone accounts  
80 for nearly 40% of Latin America’s energy output) (British Petroleum, 2019). Similarly,  
81 declines of yearly average hydropower outputs of nearly 15% over Southern Africa  
82 coincided with the continuous droughts observed over the region between 2015-2017.  
83 Elsewhere the risks associated with low flows at the hydropower project-level have been  
84 widely documented (Gaudard et al., 2014; Harto et al., 2012; Kuusisto, 2004; Loisulie,  
85 2010; Madani and Lund, 2010; Mukheibir, 2013; Piman et al., 2013; Rübhelke and  
86 Vögele, 2011; van Vliet et al., 2016a). As for high floods, record rainfalls and floodwaters  
87 in California in 2017 damaged the spillway of the Oroville Dam which resulted in the  
88 largest evacuation registered in California and nearly caused the complete failure of the  
89 tallest dam in the United States (Hollins et al., 2018). Similarly, stormwaters in the

90 Uttarakhand region in north India in 2013 are thought to have damaged about 70  
91 hydropower dams and even inundating powerplants (Mishra, 2015; SANDRP, 2013).

92

93 In spite of the important previous efforts to estimate future risks and changes in  
94 hydropower production (Antwi and Sedegah, 2018; Koch et al., 2011; van Vliet et al.,  
95 2016b), the specific hydrological conditions facing the sector as it contributes to meeting  
96 the targets of the Paris Agreement are still not clear. This problem is particularly acute if  
97 the sector aims to build resilience to hydroclimatic conditions, to sustain its role in  
98 reducing the carbon footprint of energy systems. Ultimately, this is a key element for the  
99 Nationally Determined Contributions (NDCs) to reduce greenhouse gas emissions while  
100 being aligned to international climatic goals and the sustainable development agenda  
101 under the United Nations Framework Convention on Climate Change.

102

103 In this study, we characterize the type of hydrological conditions and potential water risks  
104 which current and planned global hydropower generation capacities may need to face in  
105 their contribution towards the Paris Agreement targets. To address this, we use river flow  
106 simulations derived from a multi-model ensemble to estimate future changes in potential  
107 water risks which may affect the hydropower sector. Here we define water risks as  
108 changes in mean flows and gross hydropower potential (GHP), changes in drought  
109 frequencies, durations, and intensities, and shifts in high flow conditions. These  
110 calculations are then used to examine exposure levels of current and future hydropower  
111 installed and planned capacities at major global regions.

112 **2. Materials and Methods**

113

114 **2.1 Multi-Model ensemble**

115 For the two climate target thresholds agreed in Paris we use generated river flows  
116 computed, from our previous study, under the Half a degree Addition warming,  
117 Projection, Prognosis, and Impacts (HAPPI) protocol (Mitchell et al., 2017; Paltan et al.,  
118 2018). HAPPI is a multi-model experiment which provides data from three 10-year  
119 simulation periods per ensemble member with prescribed atmospheric forcing, sea-  
120 surface temperature and sea-ice coverage. By using prescribed future Sea Surface  
121 Temperatures (SSTs) this framework reduces the influence of model sensitivity while  
122 simulating a narrowly defined range of future temperature targets (Mitchell et al., 2017).  
123 The three scenarios are: 1) The reference or historical period which ranges from 2006 to  
124 2015, 2) a future decade that is 1.5 °C warmer than pre-industrial levels, and 3) a future  
125 decade that is 2.0 °C warmer than pre-industrial levels. In the HAPPI protocol, the 2006–  
126 2015 decade is chosen since it contains a range of different SST patterns which allows an  
127 assessment of how the ocean conditions vary on inter-annual timescales.

128

129 Also, each of the three scenarios contains the outputs of four HAPPI AGCMS: CanAM4  
130 (100 ensemble members); CAM4-2degree (100 ensemble members); NorESM1-HAPPI  
131 (125 ensemble members), and MIROC5 (50 ensemble members). It is important to note  
132 that each simulation within an experiment differs from the others in its initial weather  
133 state. So, the use of 50-125 10-year time slices in reality provide us with 500-1250 years  
134 of data per scenario (including the 2006-2015 baseline). This extensive record in turn  
135 provides the basis for robust hydrological calculations.

136

## 137 **2.2 Runoff Routing and River Flow**

138 Daily runoff derived, or calculated, from the four AGCMS and their ensembles were  
139 routed following a grid-based hydrological routing scheme as presented by Dadson et al.,  
140 (2011). This scheme follows a discrete approximation to the 1-D kinematic wave equation  
141 with lateral inflow using an approximation to the St. Venant equations for gradually-  
142 varying flow in open channels (Oki and Sud, 1998). Under this scheme, kinematic routing  
143 is applied separately to surface and sub-surface runoff, and the routing model also  
144 distinguishes between land and river pathways by using different wave speeds. Also, this  
145 scheme uses the river network derived from a vector-based network tracing method  
146 (NTM) which dictates river channel directions, paths, and locations (Olivera and Raina,  
147 2003). Due to its simplicity and more realistic representation this method has been widely  
148 used for river routing large-scale studies (as this one). Further details about the validation  
149 as well as description of characteristics of the flows calculated under this approach and  
150 for this climatic protocol can be found in (Paltan et al., 2018)

151

152 The spatial resolution of river flows used in our study is half degree (0.5° x 0.5°). Our  
153 daily flow values do not include anthropogenic interventions such as impoundments,  
154 diversions or water abstractions.

155

## 156 **2.3 Change in Gross Hydropower Potential**

157 The calculation of Gross Hydropower Potential (GHP) is based on the approach following  
158 equation (1) (Gross and Roppel, 2012; Lehner et al., 2005):

$$159 \quad GHP = Q * \rho * g * \Delta H \quad (1)$$

160

161 Where  $GHP$  at each grid location is expressed in Watts;  $Q$  is volumetric flow rate  
162 expressed in m<sup>3</sup>/s (derived from our multi-ensemble river flow data) for each grid point;



163  $\rho$  is the density of water (1000 kg/m<sup>3</sup>);  $g$  is the gravitational acceleration (9.807 m<sup>2</sup>/s),  
164 and  $\Delta H$  is the elevation difference (in meters) calculated within each grid cell.

165

166 Elevation differences within a grid cell were obtained from the GMTED2010 Global  
167 Grids DEM at 7.5-arc-seconds (~225 m)(Danielson and Gesch, 2011). Thus, this finer  
168 spatial resolution permits us to calculate elevation differences found within an input grid  
169 river flow grid cell (0.5° x 0.5°). Using Eq.(1) we obtained global daily GHP estimates  
170 for both climate scenarios (1.5°C and 2.0°C) and for the reference period at each grid  
171 location.

172

## 173 **2.4 Change in Drought Conditions**

174 We describe future changes in drought conditions in terms of the frequency (number of  
175 drought events), duration (length of drought events), and intensity (cumulative water  
176 deficit) of hydrological droughts at both climate targets, when compared with its  
177 historical flow values at each grid point. Hydrological droughts are diagnosed using the  
178 commonly-used threshold level method (Fleig et al., 2006; Hisdal and Tallaksen, 2003;  
179 Van Loon, 2015a; Van Loon and Van Lanen, 2012; Yevjevich, 1967). This technique is  
180 known for capturing the patterns and deficiencies in seasonal high-flows especially in  
181 areas with abrupt changes in river flows and is recommended for use in global scale  
182 studies (Beyene et al., 2014). With this technique, a drought episode is detected when  
183 river flow values fall below a determined threshold level. In this study, we assume that  
184 the threshold level for any given day is calculated based on the 80<sup>th</sup> percentile derived  
185 from the flow duration curve of flow in the 30-day-average time window for that day of  
186 the year. This time window is moved through the daily river flow time series in order to

187 calculate threshold values per day. The 80<sup>th</sup> percentile threshold was chosen based on  
188 previous studies (Van Loon and Van Lanen, 2012)

189

190 Drought events are considered mutually-dependent and, consequently, they are pooled if  
191 the inter-event time is 10 days or less (Fleig et al., 2006). Next, minor droughts are  
192 eliminated if they are of 15 days duration or less. From here, the intensity measure used  
193 is the water deficit volume, which is obtained as the sum of the difference between the  
194 historical threshold level and the projected river flow at both scenarios (1.5°C and 2.0°C)  
195 (Zelenhasić and Salvai, 1987). More details on the definitions and applications of drought  
196 definitions, the variable threshold approach and smoothing procedures used in this study  
197 can be found in Van Loon, (2015b)

198

199 Last, shifts in frequency, duration, and intensity are represented by the ratio of changes  
200 between the historical and the two projected scenarios, as used in previous global  
201 hydrological risk studies (Hirabayashi et al., 2008). Ratios of Change (RC), at each grid  
202 location, is given by Equation (2):

203 
$$RC = \frac{V_{Projected}}{V_{Reference}}, \quad (2)$$

204 where  $V_{Projected}$  is the future state of each variable (frequency, duration, or intensity) under  
205 1.5°C or 2.0°C warming scenarios.  $V_{Reference}$  is the historical-reference state of such  
206 variable.

207

## 208 **2.5 Changes in high river flows**

209 The shift in extreme high flows was obtained by calculating the change in the probability  
210 (return period) of the historical 1-in-100-year river flow under both climatic scenarios.

211 For this, we adjusted the annual maximum daily river flows of our scenarios to a two-

212 parameter Gumbel distribution (Paltan et al., 2018).

## 213 **2.6 Current and planned hydropower capacities and exposure levels**

214 In order to estimate global and regional changes in exposure levels of current hydropower  
215 generation capacities, we use the Global Dams and Reservoir Dataset (GRanD) (Lehner  
216 et al 2011)<sup>24</sup>. From this dataset we selected those dams where the main or secondary use  
217 is for hydroelectricity generation out of multiple uses, resulting in obtaining 7,033  
218 locations of dam assets around the world. For future hydropower projects, we obtained  
219 the spatial distribution of planned global hydropower projects from the Future  
220 Hydropower Reservoirs and Dams Database (FHReD) (Zarfl et al., 2015). This dataset  
221 consists of 3,700 records of hydropower dams with a capacity greater than 1 MW. Both  
222 datasets provide generation capacities for each hydropower project, from which we  
223 estimate total regional, and thus global, hydropower capacities expressed in GW. Note  
224 also that for various countries (such as Egypt) there is no information on current  
225 hydropower dams.

226

227 Next, for each hydropower asset we determine the level of exposure to each of the  
228 hydrological conditions described above. This is done by overlapping the spatial  
229 distribution of existing and planned hydropower assets with the layers describing the  
230 changes in GHP, hydrological droughts, and high flows. Asset-level exposures were then  
231 aggregated at the regional level by summing the total exposed capacity, within each  
232 region, describing shifts in a given hydrological condition.

233

234 Individual grid locations capture upstream catchment processes via the river routing  
235 approach described previously in section 2.2. So, single-point exposure levels, for the  
236 water risks examined here, already consider grid cells, and processes, upstream of

237 individual dam sites. We acknowledge that while our single-dam grid approach does  
238 capture upstream processes, in some cases reservoir areas may expand over more than  
239 one grid cell. Yet, by overlapping GRanD reservoir extents for the current dam-sites used  
240 here, we find that less than 5% of them share two or more grids. In particular, in less than  
241 1% of dams, their reservoirs span across five or more grid cells (51 largest global dams,  
242 list provided in Supplementary 1). As such, almost all global reservoirs (and their dams)  
243 and thus our hydropower and exposure level calculations fall within individual grid cells.  
244 As our dataset of planned dams does not have reservoir layers we assume that the same  
245 association is valid.

246

247 Overall, the aim of the above approach is to provide a high-level understanding of the  
248 potential implications of water risks on hydropower capacities. We recognize limitations  
249 of our approach and note that our assumptions result in a conservative assessment. Also,  
250 we have considered the dam sites and their production capacities to be constant in the  
251 future climate change scenarios.

252

253 Lastly, the presentation of our global results are split into the following major global  
254 regions we use are the following: Commonwealth of Independent States (CIS), East Asia,  
255 Europe, Latin America and the Caribbean (LAC), Middle East and North Africa  
256 (MENA), North America, South Asia and Oceania, and Sub-Saharan Africa

257

258

### 259 **3. Results**

260 Our results first project a slight increase in current mean global GHP for both climate  
261 scenarios. We estimate current global GHP (multi-model ensemble mean) at  
262 61.40PWh/year (standard deviation of 16.40 PWh/year) while in the 1.5°C scenario,  
263 global GHP is 63.25 PWh/year (increase ~3%) and at 2.0 °C this value reaches 64.50  
264 PWh/year (increase ~4.95%) (a map of GHPs spatial distributions is given in  
265 Supplementary Figure 2). We find the spatial distribution of GHP does not vary  
266 significantly across the four models used in our study (see Supplementary Figure 3) and  
267 our current GHP estimation is consistent with recent global GHP estimates (Bartle, 2002;  
268 Hoes et al., 2017; Pokhrel et al., 2008; Van Vliet et al., 2016). Also, our projected values  
269 are similar to previous estimates that also project an increase in GHP of 2.4% and 5.3%  
270 for the RCPs 2.6 and 8.5 scenarios, correspondingly (van Vliet et al., 2016b).

271

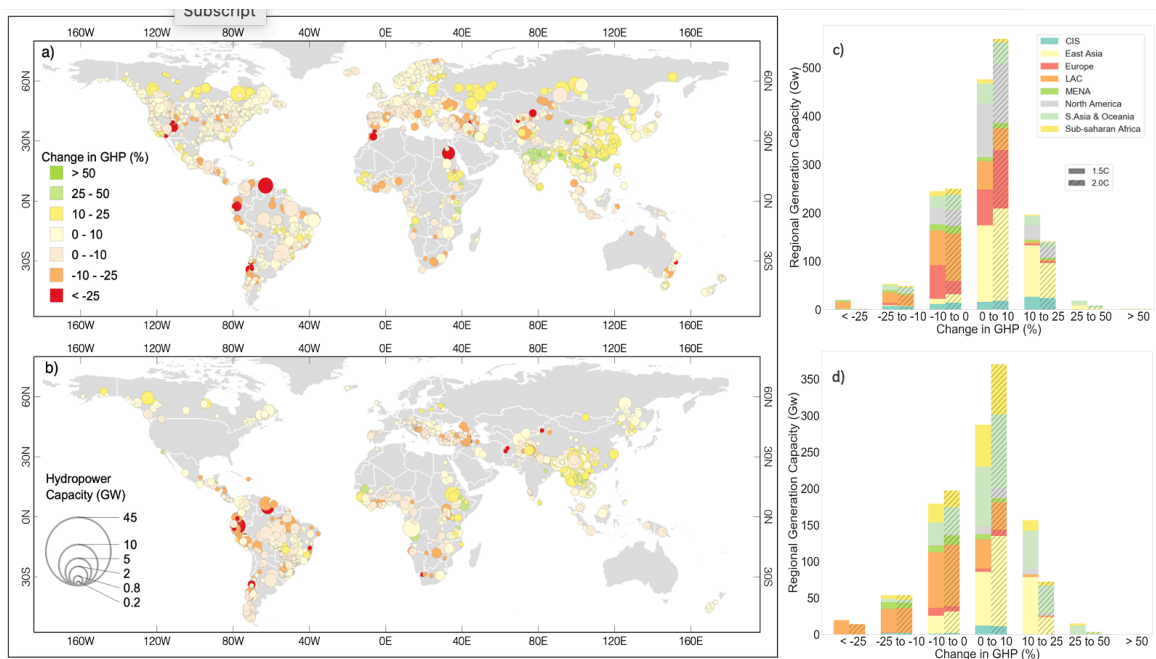
#### 272 **3.1 Changes in Hydropower Potential**

273 The increase in GHP leads to about 215GW of global capacity (or approximately 20% of  
274 the total) seeing a growth in GHP of at least 10% under a 1.5°C scenario (See Figure 1).  
275 The global region where this is important is East Asia. Nonetheless, existing and planned  
276 hydropower potentials in other global regions may be severely diminished.

277

278 Considerable generation potentials and plants in both existing and planned hydropower  
279 assets in Latin America, the Caribbean (LAC) and Sub-Saharan Africa will be at risk of  
280 reductions in GHP for both climatic scenarios. In LAC about 20% (~35 GW) of current  
281 capacity and about 30% (about 55 GW) of that planned would see GHP decreasing by  
282 10% or more, at a 1.5 °C scenario. In Sub-Saharan Africa about 5% of current (6 GW)

283 and 10% (2.5 GW) of planned hydropower capacities would lose 10% or more GHP under  
 284 a 1.5 °C scenario.



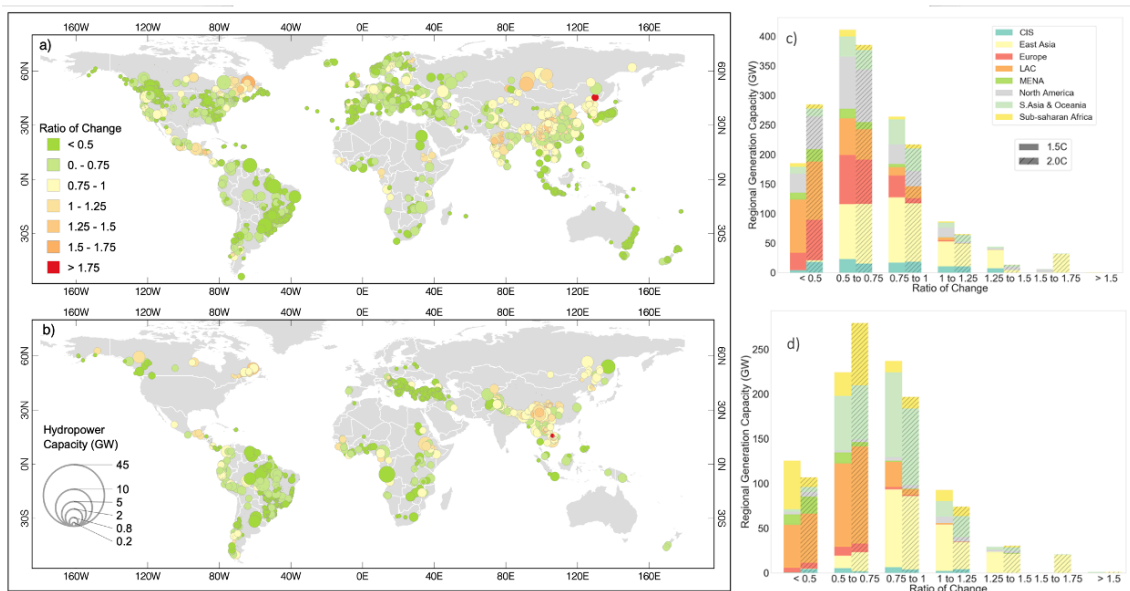
285  
 286 Figure 1. Global hydropower dam sites exposed to changes in GHP at 1.5 °C for a) current  
 287 and b) planned hydropower projects; multi-model ensemble global mean of total  
 288 generation capacity exposed to levels of change in GHP at 1.5 °C and 2.0 °C scenarios for  
 289 c) current and d) planned hydropower capacity. Exposure maps for a 2.0 °C scenario are  
 290 found in the Supplementary Section 7.

291

### 292 3.2 Hydropower Exposure Levels to Changes in Drought Frequencies

293 Our results in Figure 2 indicate that most of the current and planned hydropower  
 294 generation plants may benefit from less frequent droughts under either climate scenario.  
 295 For instance, less than 5% of current installed capacity and none of that planned would  
 296 experience  $RC > 1.25$  at a 1.5°C. By contrast, ~900GW (or ~85%) of global installed  
 297 capacity would experience either no change or less frequent droughts. This apparent  
 298 benefit may be explained by the general global decrease in the frequency of droughts at  
 299 1.5°C and 2.0°C scenarios (yet some regions in LAC and East Asia may experience more

300 frequent droughts) (see Supplementary Figure 4). This in turn may be due to the projected  
 301 increase in the number of days with precipitation found between the two climate scenarios  
 302 in various global regions including West-central North America and Siberia (within CIS).  
 303  
 304 Yet, within these estimates, it should be noted that about 20% of current and planned  
 305 installed capacity in East Asia (about 70 GW) is in areas where the frequency of droughts  
 306 will tend to generally increase in a 1.5°C warmer world. More importantly, in this region  
 307 the total amount of planned hydropower capacity which would be at risk of the most  
 308 frequent droughts would increase twofold under a 2.0°C scenario.



309  
 310 Figure 2. Exposed hydropower generation capacity to changes in drought frequencies at  
 311 1.5 °C relative to the historical baseline, for a) current and b) planned hydropower  
 312 projects. Exposure maps at a 2.0 °C scenario are found in the Supplementary Section 7.  
 313 Panels on the right show total exposure values for key global regions at 1.5 °C and 2.0°C  
 314 scenarios for c) current and d) planned hydropower capacity. Change in exposure  
 315 represents the mean value calculated across the ensemble members of the four AOGCMs  
 316 used in this study.  
 317

### 318 3.3 Hydropower Exposure Levels to Changes in Drought Durations

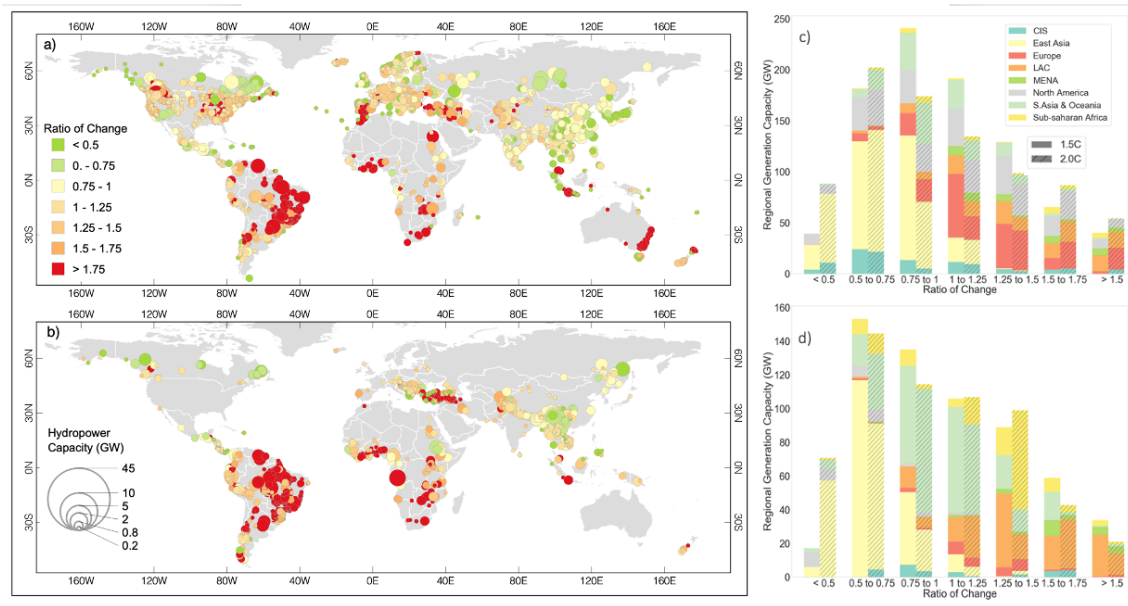
319 Opposite to changes in GHP and drought frequencies we find that the exposure levels of  
320 global hydropower to drought durations importantly increase in both scenarios (Figure  
321 3(c)). Globally, about half of global current hydropower (about 500GW) capacity would  
322 be exposed to droughts at least 10% longer ( $RC > 1.1$ ) than the historical ones in a 1.5 °C  
323 scenario. For planned hydropower projects, about 15% (120GW) of such projects will be  
324 exposed to longer droughts under 1.5 °C scenario. In a 2.0 °C scenario, the hydropower  
325 capacity at risk progressively increases to 400GW and 140GW for current and planned  
326 projects, accordingly. This global trend may be explained by the projected decrease in the  
327 number of rainy days (and drying trends) which has been previously identified in areas  
328 such as the Mediterranean basin (here within Europe and MENA) , Central and Northern  
329 regions of Europe, various areas in South America (within LAC) , and Australia (within  
330 East Asia and Oceania) (Lehner et al., 2017; Schleussner et al., 2016). See Supplementary  
331 Figure 5 and Supplementary 6 for an expanded discussion on changing droughts  
332 characteristics at both scenarios across the range of AOGCMs used here.

333

334 The regions where most of its current plants are expected to be at risk of longer droughts  
335 include Europe (~70% of total capacity, or 115GW at a 1.5 °C scenario), North America  
336 (~40% of current capacity or 70GW), and the Middle East and North Africa (MENA)  
337 region (~16%; 5.5GW). Also, in both, North America and Europe about 35% of their  
338 existing hydropower capacity is located in areas with expected  $RC > 1.25$ . In Europe it is  
339 worth noticing that the total hydropower capacity located in areas where drought  
340 durations rise by 50% or more ( $RC > 1.5$ ) would increase four-fold from a 1.5 °C to a 2.0  
341 °C scenario (from ~12 GW to ~50 GW).

342





343

344 Figure 3. Exposed hydropower generation capacity to changes in drought durations at 1.5  
 345 °C relative to the historical baseline, for a) current and b) planned hydropower projects.  
 346 Exposure maps at a 2.0 °C scenario are found in the Supplementary Section 7. Panels on  
 347 the right show total exposure values for key global regions at 1.5 °C and 2.0°C scenarios  
 348 for c) current and d) planned hydropower capacity. Change in exposure represents the  
 349 mean value calculated across the ensemble members of the four AOGCMs used in this  
 350 study.

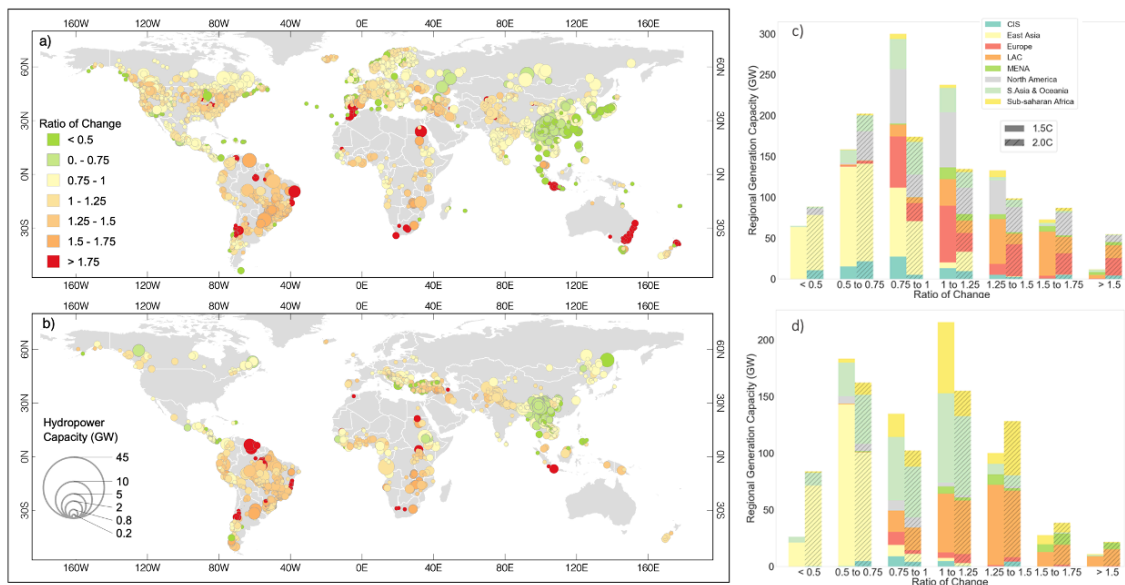
351

352 Moreover, a major and critical share of planned hydropower capacity is also expected to  
 353 be affected by longer droughts in LAC, Africa Sub-Saharan, South Asia and Oceania, and  
 354 CIS (Figure 3b,d). In these regions about 80%, 70%, 60%, and 25%, correspondingly, of  
 355 planned hydropower projects may have to face droughts which are at least 10% longer.  
 356 Also, unlike drought frequencies, hydropower assets in East Asia may expect to  
 357 experience a decrease in duration of historical dry periods.

358

### 359 3.4 Hydropower Exposure Levels to Changes in Drought Intensities

360 Next, we find that, globally, ~240 GW of global installed capacity (~25% of total) and  
 361 ~100GW (~60%) of planned hydropower capacity is exposed to droughts which are 10%  
 362 more intense, or more, under a 1.5 °C scenario (Figure 4). In a 2.0 °C scenario these  
 363 estimates increase to ~340 GW (~35%) for current capacities, whereas for planned ones,  
 364 the estimates just increase by 5 GW.



365  
 366 Figure 4. Exposed hydropower generation capacity to changes in drought intensities at  
 367 1.5 °C relative to the historical baseline, for a) current and b) planned hydropower  
 368 projects. Exposure maps at a 2.0 °C scenario are found in the Supplementary Section 7.  
 369 Panels on the right show total exposure values for key global regions at 1.5 °C and 2.0 °C  
 370 scenarios for c) current and d) planned hydropower capacity. Change in exposure  
 371 represents the mean value calculated across the ensemble members of the four AOGCMs  
 372 used in this study.

373  
 374 For current plants, the most affected regions in a 1.5 °C scenario include Europe (50%, or  
 375 80GW), LAC (70%) or 130GW, North America (55% or 100GW), and MENA (75% or  
 376 25GW). Yet it is important to note particular regional clusters exposed to more intense  
 377 droughts in specific sub-regions. For instance, large existing hydropower plants are

378 exposed to more intense droughts in South East Australia, South Africa, and the Iberian  
379 Peninsula; this in turn may reduce energy generation potentials in these regions.

380

381 Moreover, while in most of these regions a 2.0 °C scenario leads to minor increases in  
382 hydropower exposed, maintaining a 1.5 °C scenario reduces future hydropower losses in  
383 Europe. In this region, a 2.0 °C scenario would expose an additional ~30GW of  
384 hydropower capacity to more intense droughts; thus putting about 70% of the continent's  
385 existing capacity at risk. Hydropower dams in other regions such as CIS and East Asia  
386 are also expected to experience increases in drought intensities, yet of less severity.

387

388 On the other hand, an important proportion of planned hydropower plants in regions such  
389 as LAC (~80% or 140GW), Africa Sub-Sahara (~75% or 80GW) and South Asia and  
390 Oceania (~60% or 70GW), are at risk of more severe droughts in a 1.5 °C climate  
391 scenarios. In these regions, a 2.0°C scenario would cause only a negligible increase in the  
392 total planned hydropower capacity at risk (< 5GW across all these regions).

393

### 394 **3.5 Exposure Levels to Changes in Extreme High Flows**

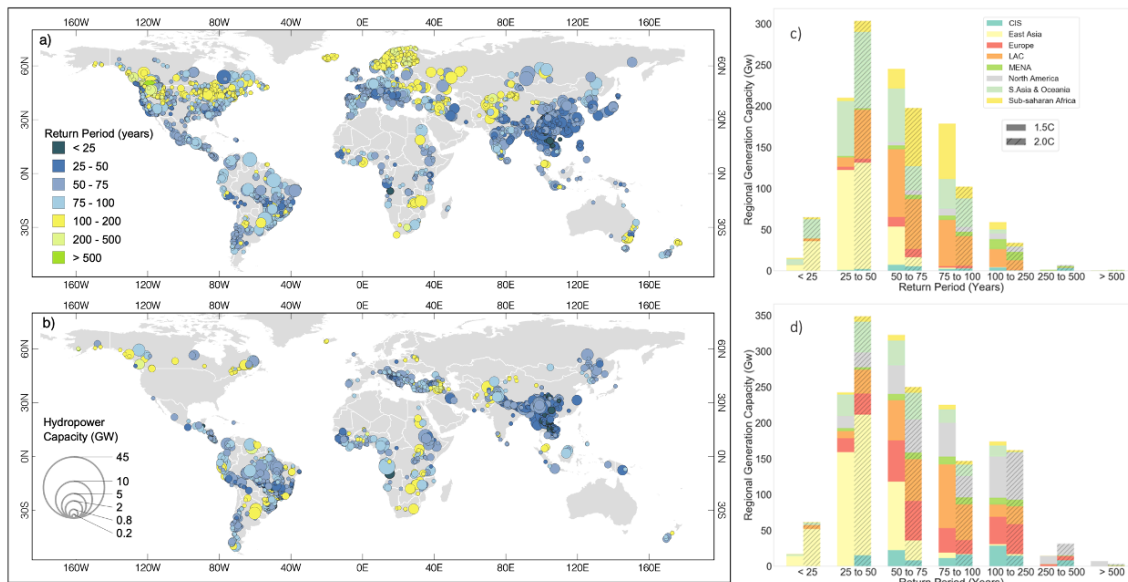
395 Last, we identify the global hydropower capacity at risk due to changes in high flow  
396 conditions. In a 1.5 °C scenario, about 65% ( about 600GW) of current global hydropower  
397 would face more frequent extreme high flows (the historical 1-in-100 years flow  
398 occurring with a frequency of 1-in-75 years or less; Figure 5). Approximately 50% (or  
399 90GW) of planned hydropower capacity would have to face this type of risk. At a 2.0 °C  
400 scenario the fraction of exposed hydropower capacity increases to ~66% (~690GW) of  
401 current installed capacity and to ~72% (~125GW) of planned. This change may be  
402 explained by the general wetting trend observed under both scenarios and particularly the

403 reported increase in global high flow characteristics (Paltan et al., 2018), particularly in  
404 Asia and Africa where considerable hydropower investments are planned.

405

406 We find a significant fraction of East Asian capacity is at risk from high flows. Here over  
407 90% of both its current and future hydropower capacities will see an increase in high  
408 flows at a 1.5 °C scenario. Similarly, South East Asia and Oceania will see an important  
409 share of their current and planned capacities at a greater risk (~80% and 55 GW; ~75%  
410 and 70 GW, accordingly). In LAC and CIS about 50% of both current and planned  
411 capacities are expected to be at risk. It is important to note that the difference between 1.5  
412 °C and 2.0 °C scenarios is highly relevant across all these regions. For example, in East  
413 Asia an extra 30% of current installed capacity would be at risk of more recurrent high  
414 flows (the historical 1-in-100 years flow occurring with a frequency of 1-in-25 years) at  
415 a 2.0 °C scenario.

416



417

418 Figure 5. Exposed hydropower generation capacity to changes in occurrences of high  
419 flows (100-year return period) at 1.5 °C relative to the historical baseline, for a) current  
420 and b) planned hydropower projects. Exposure maps at a 2.0 °C scenario are found in the

421 Supplementary Section 7. Panels on the right show total exposure values for key global  
422 regions at 1.5 °C and 2.0 °C scenarios for c) current and d) planned hydropower capacity.  
423 Change in exposure represents the mean value calculated across the ensemble members  
424 of the four AOGCMs used in this study.

425

#### 426 **4. Discussion**

427

428 In this study we have described the water risks that the global hydropower sector may  
429 have to face in its path towards achieving the climatic goals agreed in Paris. Here, by  
430 calculating exposure levels of hydropower capacities, we provide an initial diagnostic  
431 which could be used as a first screening which identifies potential vulnerable regional  
432 hotspots. Our findings would facilitate the application of more sophisticated approaches  
433 (including more advanced modelling and methodological techniques) which estimate  
434 energy production vulnerabilities and, indeed, risk at finer resolutions.

435

436 Our results show that the global hydropower sector will have to face diverse,  
437 simultaneous, and compound water risks. We find that the increase in high river flow  
438 frequencies (in this study understood as the change in the 1-in-100-years flow) would be  
439 the dominant water risk that existing and planned hydropower sites may have to face in  
440 the future. As such, we find that, about 65% (about 600GW) of current global hydropower  
441 installed capacity will be exposed to more frequent high flows at a 1.5°C scenario (the  
442 historical 1-in-100 years flow occurring with a frequency of 1-in-75 years or less). In  
443 particular, about 90% of installed capacity and 50% of that planned in East Asia will be  
444 exposed to this type of water risk. While the actual extent at which specific global sites  
445 would be damaged or not by these increases depend primarily on their design

446 characteristics, more frequent extreme flows may lead to shifts in sedimentation rates and  
447 the subsequent reduction of the available reservoir depth and volume (diminishing the  
448 hydropower generation potentials), structural damage to dams which may result in dam  
449 failures, inundation of key infrastructure such as powerplants, inundation of downstream  
450 lands (as result of contingency floodwater releases), or general diminishing of life  
451 expectancies of hydropower projects. In this case, decision makers in these affected areas  
452 may look to strategies looking to modify operational rules of projects, provide additional  
453 flood mitigation interventions at the catchment scale (traditional or green), or even  
454 reinforce and change the structural characteristics of such projects.

455

456 We also find that low flows would be an important risk to the hydropower sector across  
457 multiple regions as most, existing or planned, hydropower projects would be exposed to  
458 one or more type of droughts. For instance, in East Asia more frequent droughts would  
459 expose about 20% of both their current and planned hydropower capacities. In Europe,  
460 North America, LAC, and the MENA region we find that between 40 and 75% of current  
461 installed hydropower capacity would have to face longer and/or more intense droughts.  
462 In fact, in Europe, maintaining a 1.5°C scenario avoid about additional 40 GW of installed  
463 capacity to be exposed to droughts which are 50% longer and more intense. Furthermore,  
464 we also find that up to 80% of planned capacities in LAC, South Asia and Oceania, and  
465 Sub-Sahara would experience at least 10% more intense or longer drought at both  
466 scenarios.

467

468 Low flows would threaten expected energy generation while also increasing competition  
469 for water with other sectors. Thus, other sectoral strategies would have to be considered  
470 including looking at diversification of energy production sources, modification of grid

471 types, and management of energy demands. Similarly, our results emphasize that  
472 activities in the energy sector in areas affected by low flows require coordinated actions  
473 with water users in other sectors such as household and industrial consumption and  
474 irrigation looking to minimize and manage water competition.

475

476 We also find that the global aggregate of current and planned hydropower plants may  
477 benefit from both greater GHP and less frequent droughts. In line with this, other studies  
478 have also suggested how climate change would lead to more hydropower global  
479 production in the regions highlighted here (e.g. the South Asia region) (Ali et al., 2018;  
480 Antwi and Sedegah, 2018; Hamududu and Killingtveit, 2012; Van Vliet et al., 2016). Yet  
481 our results suggest that while, indeed, global GHP, and in consequence global electricity  
482 generation, may increase in the future as the world warms, there may be regional  
483 imbalances in electricity production as well as other type of water risks which would  
484 exacerbate water competition with other sectors. This is particularly important for  
485 developing regions since important amounts of their planned hydropower capacities and  
486 plants are located in areas which would experience more intense and longer droughts or  
487 high flows risk.

488

489 Thus, in regions with depleting GHP energy security agendas as well as plans to  
490 decarbonize energy systems, and potential commitments to meet the Paris Agreement,  
491 may be compromised. Accordingly, in these regions, our results suggest the need of  
492 decision makers to evaluate the tradeoffs between the costs (financial, social,  
493 environmental, or others) of the potential interventions which may be needed to address  
494 the type of risks discussed here, apart from the traditional costs that hydropower projects  
495 have, vis-a-vis the benefits obtained from them. Such tradeoffs and potential risks need

496 to be considered in the broader context, at regional or global spheres, when addressing  
497 strategies to meet climatic goals, such as the ones agreed in Paris. Ultimately, failing to  
498 address the risks discussed here, may threaten not just energy security goals at national  
499 scales but may also limit the ability of the hydropower sector to contribute to climate  
500 change mitigation.

501

## 502 **5. Conclusions**

503

504 Our results are expected to provide the general water context which decision makers in  
505 the hydropower sector may have to face while delivering the Paris climate goals. We first  
506 find that high river flow frequencies and potential floods would be the dominant water  
507 risk (65% of global installed hydropower capacity exposed to more frequent high flows).  
508 At the same time, we find that most existing or planned hydropower projects would be  
509 exposed to one or more types of drought. In general, our results find that in various global  
510 regions, mainly in the developing world, up to 80% of existing and planned hydropower  
511 capacities are located in areas where droughts are projected to become at least 10%  
512 longer, compared to historical conditions, and where historical 1-in-100 year flows would  
513 occur with a frequency of at least 1-in-75 years.

514

515 Yet, we also acknowledge the other technical, social, environmental or economic factors  
516 that describe a hydropower project as well as other sectorial metrics which are not  
517 considered here. This includes additional detailed understandings of the roles of  
518 compounding and reservoir characteristics. We do not consider the complex dynamics  
519 which dominate hydropower and energy demand which may aggravate the impacts  
520 discussed here. For example, water shortages resulted from more intense droughts in the



521 key regions described here may affect local communities and the surrounding  
522 environment of a hydropower project causing knock-on effects on hydropower  
523 generation; especially if water is diverted for agriculture, industry and municipal drinking  
524 water supplies. Similarly, we do not consider dam operational characteristics which  
525 would help to understand electricity generation dynamics and in turn the vulnerability of  
526 generation rates to future change. So our results should be interpreted considering these  
527 limitations. Incorporating this wide range of factors and their interplay, along with  
528 project-level hydroclimatic characteristics, could ultimately describe the specific level of  
529 risk of energy generation and conditions of energy security of the regions discussed here.

530

531 We do not expect that the patterns described here would substantially differ when  
532 evaluated using CMIP6 model outputs. Recent estimates suggest similar overall patterns  
533 of increase and decrease in runoff and flood frequency between CMIP5 models used here  
534 and those from CMIP6 (Hirabayashi et al., 2021). Also, various of the drought hotspots  
535 identified here such as the Amazon, Southern Africa, and Australia, have also been  
536 acknowledged in recent studies (Cook et al., 2020). Yet, it is important to note that the  
537 HAPPI ensemble used in this study is designed to quantify the relative risks associated  
538 with 1.5°C and 2°C warmer worlds, rather than looking at specific emission scenarios.

539

540 Taken together, the results of this study help to determine whether, at the regional scale,  
541 the cost of designing in water-risk resilience and adaptation strategies would outweigh  
542 the benefits expected from such hydropower projects. In turn, this analysis could help  
543 align the international hydropower sector towards climatic and sustainable development  
544 agendas.

545

546

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551

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