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#### ABSTRACT

Heavy rainfall and flooding associated with tropical cyclones (TCs) are responsible for a large 25 number of fatalities and economic damage worldwide. Despite their large socio-economic 26 impacts, research into heavy rainfall and flooding associated with TCs has received limited 27 attention to date, and still represents a major challenge. Our capability to adapt to future changes 28 29 in heavy rainfall and flooding associated with TCs is inextricably linked to and informed by our understanding of the sensitivity of TC rainfall to likely future forcing mechanisms. Here we use a 30 set of idealized high-resolution atmospheric model experiments produced as part of the U.S. 31 32 CLIVAR Hurricane Working Group activity to examine TC response to idealized global-scale perturbations: the doubling of CO<sub>2</sub>, uniform 2K increases in global sea surface temperature 33 (SST), and their combined impact. As a preliminary but key step, daily rainfall patterns of 34 composite TCs within climate model outputs are first compared and contrasted to the 35 observational records. To assess similarities and differences across different regions in response 36 37 to the warming scenarios, analyses are performed at the global and hemispheric scales and in six global TC ocean basins. The results indicate a reduction in TC daily precipitation rates in the 38 doubling CO<sub>2</sub> scenario (on the order of 5% globally), and an increase in TC rainfall rates 39 40 associated with a uniform increase of 2K in SST (both alone and in combination with  $CO_2$ doubling; on the order of 10-20% globally). 41

43 **1. INTRODUCTION** 

Every year, tropical cyclones (TCs) are responsible for a large number of fatalities and vast economic damages (e.g., Rappaport 2000, Pielke et al. 2008, Zhang et al. 2009, Jonkman et al. 2009, Czajkowski et al. 2011, 2013, Mendelsohn et al. 2012, Peduzzi et al. 2012). To compound these TC hazards, over the last few decades there has been an increase in population and infrastructure in global coastal regions resulting in increased TC-related damages (e.g., Mendelsohn et al. 2012, Peduzzi et al. 2012); this demographic change is acting in addition to the TC changes projected to occur as a result of climate change.

51 Although heavy rainfall is a major hazard associated with TCs, few studies have examined the rainfall patterns associated with these storms. A recent analysis of observations found that 52 over the period 1994–2008 TC-related heavy rainfall events in the United States occurred over 53 twice as often as the long-term average (Kunkel et al. 2010). Using satellite-based estimates of 54 rainfall, Lau and Zhou (2012) point to an increase in north Atlantic TC rainfall over the period 55 56 1988-2007. At the same time, they also identified a decrease in TC rainfall in the north Pacific. Over China, Ren et al. (2006) found decreasing trends in both TC total precipitation and 57 frequency of torrential rain, while Ying et al. (2011) found increasing trends in the intensity of 58 59 tropical cyclone precipitation at some locations over southeast China. Based on climate model outputs, Knutson and Tuleya (2004) found a tendency for larger near-storm precipitation rates in 60 TCs in CO<sub>2</sub> warming scenarios. In a review of TC/climate change studies, Knutson et al. (2010) 61 62 found seven studies reporting an increase in TC-related rainfall (various metrics) under climate warming scenarios and no studies with decreases. Overall, TC-related rainfall rates are projected 63 to increase on the order of 20% within 100km from the storm center for the late 21<sup>st</sup> century 64 65 (Knutson et al. 2010). More recently, Knutson et al. (2013) used a range of global climate

66 models (GCMs), including outputs from climate models produced under phase 5 of the Coupled 67 Model Intercomparison Project (CMIP5; Taylor et al. 2012), and found an increase in the 68 average precipitation rate in north Atlantic TCs of about 10%, rising to over 20% within 100km 69 of the storm center. Because of the observed and projected changes in TC rainfall and especially 69 because of their large socio-economic effects, it is essential to evaluate TC rainfall patterns under 70 warming scenarios.

The main goals of this study are to undertake a global scale analysis in six TC basins to analyse possible changes in TC rainfall under different warming scenarios using GCM runs. The research questions we will address are:

How well can GCMs reproduce the TC rainfall structure present in the observational
 records? Despite the simplicity of the question, very few studies have examined the
 capability of GCMs in reproducing the rainfall characteristics compared to the
 observational records.

2) What are the possible changes in TC rainfall that can be expected under different
idealized warming scenarios? We will be able to address this question using a series of
idealized experiments conducted in support of the U.S. CLIVAR – Hurricane and
Climate Working Group.

The analyses will leverage on three state-of-the-art atmospheric models, and examine the changes in TC rainfall structure and magnitude in six TC genesis basins under three warming scenarios: (1) a doubling of  $CO_2$  in the atmosphere with no change in SST, (2) a uniform 2K rise in global SST, and (3) a doubling of  $CO_2$  plus a uniform 2K rise in SST. The expectation prior to performing the analyses is for a decrease in TC rainfall under the  $CO_2$ -doubling experiment and for an increase associated with the global increase in SST. It is more difficult to know a priori what to expect from a combination of changes in both  $CO_2$  and SST because of the potentially opposite effects associated with the changes in these two forcings. One of the main objectives of the U.S. CLIVAR working group, and these experiments, is to quantify changes in tropical cyclone characteristics in a warming climate.

93 This paper is organized as follows. The next section contains a description of the data, 94 methods and models used. Section 3 presents the results, and is followed by Section 4, in which 95 we summarize the main points of this study.

#### 96 **2.** DATA AND METHODS

97 Six TC genesis basins were used in this analysis, four in the northern hemisphere (north 98 Atlantic (NA), eastern north Pacific (EP), western north Pacific (WP), north Indian (NI)) and two 99 in the southern hemisphere (south Indian (SI) and southern Pacific (SP)). The delineation of 100 these basins is the same as the one used in Camargo et al. (2005), with the only exception that we 101 combine their Australian and south Pacific basins into the southern Pacific basin, which extends 102 eastward from 110W longitude, in order to have a larger storm sample. We also perform 103 analyses at the global and hemispheric scales.

Observed TC tracks were taken from the International Best Track Archive for Climate Stewardship (IBTrACS v03r04; Knapp et al. 2010). It represents a unified database of global TC tracks, including data from numerous TC forecast centers around the world and other sources. The IBTrACS includes the latitude and longitude of the center of circulation of the recorded storms, maximum sustained wind and minimum central pressure every six hours during the storms' lifetime. Here we focus on the period 1997-2012 because it matches the period for which relatively high quality daily rainfall data are available globally.

111 Rainfall data are available over the period 1997-2012 through the Global Precipitation Climatology Project (GPCP; Huffman et al. 2001). This dataset provides global rainfall at the 112 daily scale with a 1°×1° resolution. GPCP is obtained by merging different satellite-based 113 rainfall estimates (in particular within and outside the latitude band 40° north-south) and rain 114 gage data. Here GPCP is used as reference dataset for the comparison with modelled data. It is 115 116 worth keeping in mind, though, that these are rainfall estimates based on satellite data, and not direct measurements of rainfall. Our assumption is that the uncertainties associated with this 117 product are much smaller than what we would expect from modelled rainfall data. 118

119 These observational records will be used to evaluate the capability of three climate models in reproducing the rainfall characteristics associated with TCs. In this study we will use outputs 120 from the Geophysical Fluid Dynamics Laboratory (GFDL) High Resolution Atmospheric Model 121 (HiRAM), the Centro Euro-Mediterraneo per i Cambiamenti Climatici (CMCC), and the 122 Community Atmosphere Model Version 5.1 (CAM5) model. The models are forced by 123 climatological SSTs [1981-2005 average from HadISST (Rayner et al. 2003)]. The GCM run by 124 CMCC builds on ECHAM5 (Roeckner et al. 2003) with the same resolution employed in the 125 CMCC fully coupled model (Scoccimarro et al. 2011): a T159 horizontal resolution, 126 corresponding to a Gaussian grid of about  $0.75^{\circ} \times 0.75^{\circ}$  and a vertical resolution with 31 hybrid 127 sigma-pressure levels with top at 10 hPa. The convection parameterization is based on the mass 128 flux concept (Tiedtke 1989) modified following Nordeng (1994). Moist processes are treated 129 130 using a mass conserving algorithm for the transport of the different water species and potential chemical tracers (Lin and Rood 1996). The transport is resolved on the Gaussian grid. A more 131 132 detailed description of the ECHAM5 atmospheric model performance can be found in Roeckner 133 et al. (2006).

134 The model used for this study is a newer version of the Geophysical Fluid Dynamics Laboratory (GFDL) High Resolution Atmospheric Model (HIRAM) utilized in Zhao et al. 135 (2009), Zhao and Held (2010), and Held and Zhao (2011) for studies of global hurricane 136 climatology, variability, and change with global warming. It is a 50km resolution model using a 137 cubed-sphere dynamical core and the Bretherton et al. (2004) convection scheme for both 138 shallow and deep cumulus clouds. The main difference in the newer version is that it 139 incorporates a new land model (GFDL LM3). The atmospheric dynamical core of the model was 140 also updated to improve efficiency and stability. As a result of these changes, there are minor 141 retunings of the atmospheric parameters in the cloud and surface boundary layer 142 parameterizations necessary to achieve the top-of-atmosphere (TOA) radiative balance (Zhao et. 143 al 2012). This model is also the version of HIRAM used for the GFDL participation in the Fifth 144 Assessment Report of the Intergovernmental Panel on Climate Change (IPCC AR5) high-145 resolution time-slice simulations. 146

The Community Atmospheric Model, version 5.1 (CAM5), developed by the U.S. 147 Department of Energy and the National Science Foundation was integrated using a finite volume 148 dynamical core on a latitude-longitude mesh of approximately 0.25° with 30 vertical levels 149 (Bacmeister et al. 2013, Wehner et al. 2013). The CAM5 physical parameterization package uses 150 the Zhang and McFarlane (1995) deep convective parameterization and the University of 151 Washington (UW) shallow convection scheme (Park and Bretherton 2009). The convective 152 153 parameterization includes a dilute entraining plume (Neale et al. 2008) and a convective momentum transport approximation as used in the previous version of the model, CAM4 154 (Richter and Rasch 2008). The moist boundary layer turbulence scheme is that of Bretherton and 155

Park (2009). A description of the surface flux parameterizations, an important driver for tropicalcyclogenesis, is described in Neale et al. (2010).

Each model had four simulations: (1) present day (Present-Day), (2) a doubling of  $CO_2$  in the 158 atmosphere (2×CO<sub>2</sub>), (3) a uniform 2K rise in SST (+2K), and (4) a doubling of CO<sub>2</sub> plus a 159 uniform 2K rise in SST ( $2 \times CO_2 + 2K$ ). The number of years in terms of rainfall data varied from 160 161 model to model (20 years for GDFL, ten years for CMCC, and nine years for CAM5). The tracking algorithm used to identify TCs in the GFDL outputs is similar to what is described in 162 Zhao et al. (2009). The tracking for the CMCC model is based on Walsh (1997) and Walsh et al. 163 164 (2007). Detailed information on the ability of climate models in representing TCs can be found in Walsh et al. (2013). The tracking algorithm for the CAM5 model follows closely the method 165 and thresholds of Knutson et al (2007) and has been generalized to execute efficiently on very 166 large numbers of processors (Prabhat et al. 2011). 167

Here we focus on the evaluation of the highest rain-producing TCs both in the models and 168 observations. For each 1200 UTC time step of each TC in the IBTrACS or in the GFDL, CMCC 169 and CAM5 models, the rainfall in a  $10^{\circ} \times 10^{\circ}$  grid around the center of circulation of the storm 170 was extracted based on the information available in the track files; these rainfall fields represent 171 172 daily rainfall accumulations and were then averaged over the storm lifetime to form a gridded composite mean of the daily rainfall associated with a particular storm. We note that only time 173 steps when the TC center was south of 30°N (for the northern hemisphere), or north of 30°S (for 174 175 the southern hemisphere) were used to guard against extra-tropical dynamics affecting the TC rainfall patterns. The composite mean TC rainfall patterns were then ranked according to the 176 highest average rainfall within a 5°-radius around the TC center, and the top 10% of the TCs 177 178 were selected. The selection of a 5°-radius around the TC center is consistent with other studies

179 in the literature (e.g., Hart and Evans 2001, Ren et al. 2006, Kunkel et al. 2010). We use a percentage rather than a specific number of storms to account for differences in the number of 180 TCs in different basins and amongst the models. Finally all the TC time steps (or storm days) in 181 the top 10% of TCs were averaged to produce a composite mean of the TC storm days. 182 Supplementary Table 1 summarizes the number of TC storm days for each model, scenario and 183 184 basin. The western Pacific is the northern hemispheric basin with the largest number of TC days with the exception of CAM5 (possibly due to a TC genesis more in the central Pacific, resulting 185 in storms counted in the eastern Pacific). We also notice the low TC activity in the CMCC model 186 187 in the north Atlantic and eastern Pacific due to this model's known issues in generating TCs in these basins (Scoccimarro et al. 2011). The results presented in the next section are related to 188 TC-daily rainfall for the top 10% rainiest TCs. 189

190

#### 191 **3. R**ESULTS

#### 192 *3.1.Observations*

Figure 1 is based on GPCP data and shows the composite mean precipitation patterns 193 associated with the top-10% rainiest TCs in each of the six basins, together with the 194 corresponding hemispheric composites. For the northern hemisphere, the rainfall patterns have a 195 southwest-northeast orientation. The areas with maximum rainfall vary among the basins, from 196 the eastern quadrants in the north Atlantic to the southwest quadrant in the western Pacific; these 197 differences may partly be an artefact of the coarse resolution of GPCP  $(1^{\circ} \times 1^{\circ})$ , but are also likely 198 to be associated with the different storm morphology in these basins. There is also a large spread 199 200 in the number of TC storm days used in the composites, with the north Indian basin having the fewest and the western Pacific the most fields used (see panel titles in Figure 1). The average 201

rainfall footprint is also very different from basin to basin. Most of the rainfall is concentrated within a 5°-radius for the north Atlantic and the eastern Pacific, with the latter showing the smallest rainfall averages among the basins in the northern hemisphere. On the other hand, the rainfall footprint for the western Pacific is much larger, consistent with the discussion in Chan and Chan (2012) related to the storm size in these basins. Overall, the TCs in the northern hemisphere present a well-defined structure, with the largest composite daily rainfall close to the center of circulation of the storms and decreasing as we move further away.

In the southern hemisphere the rainfall patterns tend to be mirror images of those observed in 209 210 the northern hemisphere, with a northwest-southeast structure, and the areas of maximum composite rainfall predominantly occurring in the southeast TC quadrant. Beside the fact that 211 over the 1997-2012 period there were more than twice as many TC days in the northern 212 hemisphere compared with the southern hemisphere, another difference is related to the rainfall 213 magnitudes. In the southern hemisphere, while most of the (storm-relative) rainfall is within a 214  $5^{\circ}$ -radius of the storm center, on average the rainfall intensities are lower than in the northern 215 ocean basins. Part of the asymmetry in the rainfall patterns could be due to the storm motion and 216 the fact that we are working with rainfall at the daily scale. 217

The median radial profiles of composite TC rainfall rates have similar structure among the different basins, with the highest rainfall rates near the center of circulation (Figure 2), and differences that are related to the different interactions that these storms have with the environment in which they develop in each basin (Lonfat et al. 2004). Owing to the coarse GPCP resolution  $(1^{\circ}\times1^{\circ})$  the eyewall structure is not captured in these profiles. These profiles are similar to the ones described in Jiang et al. (2008) for the north Atlantic, and Lonfat et al. (2004) at the global scale once we account for GPCP's coarser resolution. More specifically, the TCs in the northern Indian have the largest rainfall rates close to the center of circulation, and a rapid decrease as distance from the TC center increases. The storms in the western Pacific have the largest composite daily rainfall rates overall, in agreement with the results in Figure 1. Conversely, the eastern Pacific TCs are generally characterized by the smallest rainfall rates. Compared to the southern Indian, the average daily rainfall rates associated with storms in the southern Pacific is consistently larger for any distance from the storm center. The results for both hemispheres are consistent with the rainfall profiles in Lonfat et al. (2004).

232 *3.2.Models* 

In this subsection we compare the rainfall patterns for the three models and examine the TC 233 rainfall response to the three idealized warming scenarios. We will start with results at the global 234 235 (Figure 3) and hemispheric scales (Supplementary Figures 1-2), and then examine changes in TC rainfall in each of the six ocean basins. At the global scale, the three models provide a consistent 236 response to the different scenarios. In the  $2 \times CO_2$  run the intensity of the composite TC rainfall 237 weakens compared to the Present-Day run. The reduction due to  $2 \times CO_2$  may be due to two 238 superimposing components. The first is a reduction in global mean precipitation associated with 239 a weaker radiative cooling rate due to a doubling in  $CO_2$ . The second is a weakening of TC 240 intensity due to an increase in surface relative humidity and a slight increase of tropospheric 241 stability (e.g., Sugi and Yoshimura 2004, Yoshimura and Sugi 2005, Held and Zhao 2011, Zhao 242 et. al 2013). The +2K, and  $2 \times CO_2$  + 2K simulations both have higher rainfall than in the Present-243 Day one, which is due to the increased SST that leads to higher air temperatures, higher water 244 vapour content and increased rainfall (Scoccimarro et al. 2013). Yoshimura and Sugi (2005) 245 discuss the opposing effects of increasing SST and CO<sub>2</sub> in terms of precipitation and dry static 246 stability. Our analyses lead to similar conclusions when we stratify the results into northern and 247

southern hemispheres (Supplementary Figures 1-2). Based on the summary values in Table 1 for area- and daily-averaged precipitation associated with the top-10% rainiest TCs, our modelling results indicate a reduction in precipitation in the doubling  $CO_2$  scenario on the order of 5% globally, and an increase in composite TC rainfall associated with a uniform increase of 2K in SST (both alone and in combination with  $CO_2$  doubling) on the order of 10-20% globally.

253 After performing analyses at the global and hemispheric scales, we focus on the each individual ocean basin, comparing and contrasting the results from the three models under the 254 three warming scenarios at a much more regional scale. We start with the GFDL model. The 255 256 composite mean TC rainfall patterns for the four northern hemispheric basins for the Present-Day and three warming simulations are shown in Figure 4. For the most part the patterns have an 257 ellipsoidal shape, with some structures exhibiting the expected southwest-northeast shape in the 258 northern hemisphere. Moreover, the rainfall patterns in the different basins tend to be similar to 259 the observations, with the TCs in the western (eastern) Pacific having the largest (smallest) 260 footprints. All basins, however, have maximum composite TC rainfall occurring in the top-left 261 quadrant, which differs from the observed patterns (Figure 1). Generally, the TC rainfall 262 intensities are comparable to the observations, with a tendency towards overestimation. To the 263 264 best of our knowledge, this is the first time that global comparisons between observed and 265 simulated TC rainfall composites have been performed.

Keeping in mind these similarities and differences between modelled and observed rainfall while interpreting the following results, we now examine the potential changes in TC rainfall under three different scenarios based on the GFDL model. In the  $2\times$ CO<sub>2</sub> run (Figure 4 second column) the intensity of the composite TC rainfall weakens compared to the Present-Day simulation (~5%-15%; Table 1), as shown by the reduced footprint of the largest rainfall areas.

271 In the case of  $2 \times CO_2$ , atmospheric radiative cooling rate decreases due to a reduction of TOA (top of atmosphere) outgoing long-wave radiative flux. In equilibrium state, the reduction in 272 atmospheric radiative cooling rate must balance by a reduction in surface precipitation and 273 evaporation. Since surface winds do not change significantly in these GCMs, surface relative 274 275 humidity must increase. The increase of surface relative humidity reduces surface evaporation 276 potential (or thermodynamic disequilibrium), which is the primarily driving force for TC genesis and intensity. Thus, this explains the general reduction of TC rainfall intensity in the  $2 \times CO_2$ 277 case. In addition, the increase in CO<sub>2</sub> concentration tend to slightly warm surface temperature 278 279 over tropical lands which leads to slight warmer upper tropospheric temperature, contributing to a slight increase in tropospheric stability which may also be partially responsible for the 280 reduction in rainfall intensity in the  $2 \times CO_2$  case. The +2K, and  $2 \times CO_2$  + 2K simulations both 281 have higher TC rainfall rates than in the Present-Day run (up to 25% in the eastern Pacific; Table 282 1). These results are valid for all the northern hemispheric basins, with the exception of the north 283 Atlantic, where TC rainfall intensity is higher than the Present-Day run for the +2K, but not for 284 the  $2 \times CO_2 + 2K$  (Table 1). 285

These results are corroborated in the median TC radial rainfall profiles in Figure 5 computed 286 287 based on the top-10% rainiest TCs; the simulations for a 2K increase in global SST (whether with or without doubling  $CO_2$ ) show the largest increase in rainfall at all distances. Similarly, a 288 doubling of CO<sub>2</sub> alone results in a rainfall decrease at most ranges. These TC rainfall profiles 289 290 also highlight the capability of the GFDL in capturing how the largest daily rainfall rates occur away from the storm center (approximately between  $2^{\circ}$  and  $4^{\circ}$ ). These results are consistent with 291 292 Lonfat et al. (2004) and Jiang et al. (2008), even though the maximum herein tends to occur 293 further away than in the aforementioned observational studies.

In the south Indian and south Pacific basins, the maximum TC rainfall from the GFDL is mostly in the bottom-left quadrant, the opposite of the northern hemisphere (cf. Figures 4 and 6). There is some evidence for the southeast-northwest orientation in the composite mean rainfall patterns, although the structures are not as well-defined as in the observations (Figure 1). Moreover, there a tendency toward larger average TC rainfall values.

299 The rainfall response for the south Indian and south Pacific basins to different warming scenarios in the GFDL is generally similar to the changes for the basins in the northern 300 hemisphere. The increase in global SST results in an overall increase in TC daily rainfall rates 301 302 (Table 1); on the other hand, a doubling of CO<sub>2</sub> results in comparable average rainfall values (Table 1). The median rainfall profiles in Figure 5 (bottom panels) highlight the differences in 303 responses for the two basins. While for the southern Indian basin the median rainfall profiles 304 tend to be generally very similar regardless of the warming scenario, we observe more variability 305 in the southern Pacific. Interestingly, the TC rainfall in the +2K scenarios is generally the largest 306 307 close to the center of circulation, while it is the smallest for the  $2 \times CO_2$  one. On the other hand, as we move away from the center of the storm, the largest rainfall intensities are for the 2×CO<sub>2</sub> 308 scenario. These results suggest that, by doubling CO<sub>2</sub> we should expect a rainfall decrease close 309 310 to the center of the storm but also a widening of the areas associated with heavier rainfall.

We have also examined the potential changes in daily TC rainfall rates associated with a 2K increase in SST based on the Clausius-Clapeyron relationship (14% increase in the Present-Day scenario; Figure 5). For the north Atlantic, Knutson et al. (2013) found that the use of the Clausius-Clapeyron relationship was able to well describe the TC rainfall rate changes at 200-400km from the center of circulation, while other processes were dominant at shorter distances. In our study and based on the GFDL global model, it is hard to find consistent results across basins and range. In the north Atlantic and south Pacific Oceans, the TC rainfall changes in the
+2K scenario are in general agreement with what we would expect based on the ClausiusClapeyron relationship. On the other hand, with the exception of the eastern Pacific, the rainfall
increases in the other basins are less than what expected based on a 7%/K increase in
atmospheric humidity.

322 The regional rainfall composite and profile results for CMCC are similar to the ones presented for the GFDL model for the six ocean basins and the three warming scenarios. Note 323 that the analyses related to the north Atlantic are presented but not discussed because of the 324 325 known issues that the CMCC model has in generating TCs in this basin (Scoccimarro et al. 2011). The same holds for the eastern Pacific, for which the number of TC days used to compute 326 the rainfall composites and profiles is much smaller than in the observations and in the GFDL 327 model. These deficiencies in sample size are too large to be ascribed to the shorter records 328 available for the CMCC model (10 years) and are more likely due to simulation deficiencies of 329 the model. 330

Figure 7 shows the composite TC daily rainfall patterns for the basins in the northern hemisphere for the CMCC model. The rainfall composites for the storms in the western Pacific and the north Indian oceans exhibit structures similar to those for the observations (Figure 1), even though the TC rainfall amounts are generally larger. Moreover, the location of the areas with the largest rainfall amounts is similar to those identified in the observations. The changes in rainfall patterns for the different scenarios lead us to the same conclusions as those drawn for the GFDL model.

By increasing the global SST by 2K, there is an increase in composite TC rainfall rates in the western Pacific and the north Indian Oceans for the CMCC model. At the same time, rainfall

rates tend to decrease for the doubled  $CO_2$  case (Table 1). This holds for both rainfall mean composites (Figure 7) and median radial profiles (Figure 8). Despite the coarser resolution of the CMCC model, there are still indications that the rainfall tends to increase from the center of the storm up to about 2°-3°, and decrease afterwards.

In the southern hemisphere the TC rainfall patterns from the CMCC model are similar to the 344 345 observations (Figure 9). The major rainfall axis is oriented northwest to southeast as in Figure 1, even though the average rainfall tends to be higher than observed. The different warming 346 scenarios provide results consistent with the northern hemisphere, as well as with those from the 347 348 GFDL model. The global increase in SST results in an increase in TC rainfall rates, which is more marked closer to the center of the storms. On the other hand, in the  $2 \times CO_2$  scenario we 349 observe a reduction in rainfall rates, with a narrowing of the areas of higher rainfall close to the 350 center of circulation. These conclusions are also supported by the analyses of the rainfall profiles 351 (Figure 8, bottom panels), in which warmer SST tends to translate to larger rainfall amounts, 352 with some differences depending on the distance from the center (possibly related to the 353 asymmetry of the precipitation near the center of the storms and changes in the location of 354 maximum rainfall). If we try to interpret the changes in rainfall profile using the Clausius-355 356 Clapeyron relationship, we have results similar to those for the GFDL model, with the profiles for the +2K scenario exhibiting less rainfall than expected according to a 7%/K increase in 357 atmospheric moisture. There is actually a better agreement between the 2K+2×CO<sub>2</sub> profiles and 358 359 those based on a 14% increase in rainfall from the Present-Day scenario.

The CAM5 is the model with the highest spatial resolution (approximately 0.25°). There are both similarities and differences with respect to the observational record and the other two models at the ocean-basin scale. Qualitatively, the TC rainfall patterns for the Present-Day runs

363 are consistent with the observations and the other models, even though the rainfall values tend to be larger than those based on GPCP and the fields are less smooth because of the higher spatial 364 resolution (Figure 10). There are a few differences in terms of the TC rainfall days. In the 365 observations and the GFDL and CMCC models, the western Pacific has the largest number of 366 TC days, followed by the eastern Pacific. For the CAM5 model, on the other hand, the number of 367 368 TC storm days is the largest for the eastern Pacific, followed by the western Pacific. Despite the differences in TC days, the storms in the western Pacific are the ones with the largest composite 369 rainfall footprint followed by the north Atlantic TCs. Finally, while the CMCC and GFDL 370 371 models and observations indicate that the rainfall associated with eastern Pacific TCs is the smallest among the basins in the northern hemisphere, this is not the case for the CAM5 model, 372 for which storms in the north Indian Ocean have the smallest rainfall values. 373

Examination of the model results for the three warming scenarios for the CAM5 model does 374 not allow a consistent interpretation of the results for all the basins. Compared to the Present-Day 375 376 climate runs (Table 1), the rainfall associated with north Atlantic, western Pacific and north Indian TCs decreases for a doubling in CO<sub>2</sub>, while it increases for the eastern Pacific storms. On 377 the other hand, there is a general increase in TC rainfall rates for the two scenarios involving a 378 379 +2K increase in global SST (Table 1). The differences among scenarios can also be assessed for different distances from the center of circulation (Figure 11, top and middle rows). Despite the 380 finer resolution, there is not the clear enhancement in rainfall rates as we move 100-300km from 381 382 the center of circulation discussed for the GFDL model and reported in observational studies (e.g., Lonfat et al. 2004, Jiang et al. 2008). We can also clearly see the changes in rainfall 383 384 profiles in response to the different scenarios. Based on the GFDL and the CMCC models and 385 published studies (e.g., Sugi and Yoshimura 2004, Yoshimura and Sugi 2005), we would have

expected a decrease in rainfall associated with a CO<sub>2</sub>-doubling. The response to increasing global
SST is generally consistent with the other models.

Figure 12 shows the composite mean daily TC rainfall rate patterns for the basins in the southern hemisphere for the CAM5 model. The results for the Present-Day climate are similar to the observational record, with the same orientation and larger rainfall associated with the storms in the south Pacific rather than in the south Indian Ocean. For both basins, there is an overall decrease in TC rainfall rates for the  $2\times CO_2$  scenario (Table 1). In the +2K case, there is an increase in TC rainfall for the south Indian and a marginal decrease for the south Pacific. Finally, more TC rainfall is generally associated with the  $2\times CO_2+2K$  scenario.

The TC rainfall profiles based on the CAM5 model for the two basins in the southern 395 hemisphere show similarities and differences with respect to the other models. For the south 396 Indian, there is not a large degree of variability among scenarios (see Figures 5 and 8 for 397 comparison with the GFDL and CMCC models). On the other hand, the median profiles for the 398 TCs in the south Pacific suggest an overall reduction in TC rainfall in the three warming 399 scenarios compared to the Present-Day run, in particular close to the center of circulation. This 400 response is different from what is observed in the other models regardless of the ocean basin. 401 402 Further work is necessary to assess what the possible causes for the discrepancies between CAM5 and the GFDL and CMCC are in the south Pacific. Similar to what was found for the 403 CMCC and GFDL models, it is difficult to interpret the results associated with the +2K scenario 404 405 in terms of a simple Clausius-Clapeyron relationship scaling argument.

### 406 **4.** CONCLUSIONS

407 This study aimed to examine potential changes in rainfall associated with TCs at the global 408 scale under different idealized global-scale perturbations. Results are based on three state-of-the409 art atmospheric models (GFDL, CMCC and CAM5) and three idealized perturbation 410 atmospheric general circulation experiments (the radiative perturbation from doubling  $CO_2$  but 411 keeping SST fixed, increasing the global SST by 2K, and a combination of the two).

An important step we undertook prior to the examination of the models' response to the 412 different scenarios involved the assessment of the models' capability in reproducing the TC 413 414 rainfall patterns in the observational records. Our findings suggest that these models are able to characterize the rainfall rate distribution associated with TCs reasonably well, both in terms of 415 rainfall mean spatial composites and radial profiles. Our results, however, also indicate that there 416 417 are discrepancies between modelled and observed TC rainfall. These discrepancies are related to both the location of the rainfall maximum and the rainfall magnitudes. Despite the relevance of 418 the TC rainfall hazard, it appears that the model evaluation of the rainfall fields is generally 419 lacking in a number of studies describing modelling of TC activity. We hope that this study 420 could represent a first step towards a more comprehensive and widespread effort in assessing the 421 422 skill of models in reproducing the rainfall properties associated with TCs.

With these model limitations in mind, we examined how TC rainfall would change in 423 response to three forcing perturbations. Even though we highlighted some differences among 424 425 models and basins, our results point to a reduction in composite TC rainfall rates (both in terms of spatial extent and magnitude) in direct response to a doubling in CO<sub>2</sub>, with SSTs remaining 426 427 unchanged. On the other hand, a 2K global increase in SST points to the opposite result, with an 428 overall increase in TC rainfall rates in all models. The spatial structure of the precipitation changes are less consistent than the spatially-averaged changes, and we found that there are no 429 430 consistent patterns among basins and distance from the center of circulation. Results at the global 431 and hemispheric scales point to an average TC rainfall reduction when doubling CO<sub>2</sub> on the 432 order of 5%, and an increase associated with a global warming of the SST by 2K (both alone and in combination with  $CO_2$  doubling) on the order of 10-20%. For individual basins, the response 433 seen in the global and hemispheric means is recovered, although with slightly more inter-model 434 spread, and some inter-basin differences. However, the overall tendency of the rainfall in the 435 idealized perturbations is recovered across most basins for all models (Table 1), including the 436 437 increase in response to a combined doubling of CO<sub>2</sub> and an increase in global SST. There are indications that the response to both doubling of CO<sub>2</sub> and 2K warming together is not a linear 438 sum of the responses to each forcing agent individually (Table 1), with the area-averaged 439 440 increase in TC rainfall in response to both forcing agents often exceeding the increase in response to a 2K increase alone – even though the response to  $CO_2$  increases alone is for a 441 precipitation decrease. Because this result was unexpected to us, and because of the relatively 442 small sample size, we choose to stop at remarking on its apparent existence, but leave further 443 exploration and assessment of its mechanisms – to the extent that it is real – to future work. 444

445 These results add to an expectation that greenhouse gas induced tropical warming should lead to an increase in rainfall rates of individual TCs (e.g., Knutson and Tuleya 2004; Knutson et 446 al. 2010, 2013). Current generation GCMs project, under a wide range of projected 21<sup>st</sup> century 447 forcing scenarios, a robust warming of the tropics and tropical cyclone basins over the 21<sup>st</sup> 448 century (e.g., Zhao et al. 2009, Vecchi and Soden 2007, Villarini and Vecchi 2012, Knutson et 449 al. 2013). Based on these projections, an increase in SST by 2K over their study area is within 450 451 the realm of possibilities – arising largely from, and accompanied by, increases in greenhouse gases. Our results indicate that the decreases in TC precipitation rates from CO<sub>2</sub> increases alone 452 453 are not sufficient, in these three GCMs, to compensate for the SST-driven increases in TC 454 rainfall rates. If current GCM projections of tropical warming and the rainfall modelling results

455 described here and elsewhere are realized, then the hazard associated with rainfall from 456 individual TCs should be increasing over the course of this century.

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- 674

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Figure 12: As in Figure 6, but for the CAM5 model. 

Table 1. Percentage changes of the three warming scenarios with respect for the Present-Day
runs for the three models for the different basins and at the global and hemispheric scales.
Results are representative of a 5°-radius area around the center of circulation for each storm.

	GFDL			CMCC			CAM5		
	$2 \times CO_2$	+2K	$2 \times CO_2 + 2K$	$2 \times CO_2$	+2K	$2 \times CO_2 + 2K$	$2 \times CO_2$	+2K	$2 \times CO_2 + 2K$
Global	-6.1	9.1	11.7	-5.4	10.7	12.8	-1.4	13.2	16.5
North hemisphere	-8.9	7.8	13.3	-6.7	15.7	17.1	1.3	14.1	16.1
South hemisphere	0.4	12.6	8.8	-6.2	0.9	4.5	-8.0	10.1	18.0
North Atlantic	-16.7	18.2	-11.8	-1.8	4.5	11.1	-8.4	-0.4	8.5
East Pacific	-6.5	25.1	17.0	-6.0	14.0	24.3	12.9	17.0	27.8
West Pacific	-5.9	2.5	16.5	-8.1	15.8	14.8	-11.1	17.1	3.7
North Indian	-17.7	0.2	17.6	1.7	21.0	21.2	-1.5	18.7	19.2
South Indian	1.1	7.3	5.8	-9.5	-1.8	-1.4	-7.6	16.4	25.6
South Pacific	-0.9	19.9	12.9	-4.5	1.8	5.3	-10.3	-0.3	10.6



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Figure 1: Composite mean observed (GPCP) daily rainfall rate patterns in the six ocean basins, as well as the composites for the northern and southern hemispheres' top-10% rainiest TCs. The number of TC storm days used in the composite is given in the panel titles. The units are mm/day, and the x and y axes correspond to degrees from the TC center.



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Figure 2: Top panel: Median radial rainfall profiles for the northern hemispheric basins including the north Atlantic (NA), eastern Pacific (EP), western Pacific (WP), north Indian (NI), and all northern hemispheric basins (NH). Bottom panel: Median radial rainfall profiles for the southern hemispheric basins including the south Indian (NI), south Pacific (SP), and all southern hemispheric basins (SH). The units are mm/day, and the x axis corresponds to degrees from the TC center.



Figure 3: Composite weighted mean daily rainfall rate patterns at the global scale for each of the three models and the different scenarios. The weights are computed based on the number of TC storm days in each basin (see Supplementary Table 1). The units are mm/day, and the x and y axes correspond to degrees from the TC center. Note that the color bar extends over a different range for the GFDL model.

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Figure 4: Composite mean daily rainfall patterns (in mm/day) for the storm days in the top-10%
rainiest TCs in the four GFDL simulations (columns) and in the four northern hemispheric TC
basins (rows). The number of TC storm days used in each composite is given in the panel titles,
and the x and y axes correspond to degrees from the TC center of circulation.



Figure 5: Median radial rainfall profiles for the northern (top two rows) and southern (bottom
panels) hemispheric basins in the four GFDL simulations. (X axis corresponds to degrees from

- the TC center. The line "Present Day (CC)" refers to the rainfall profile for the "Present Day"
- increased by 14%, corresponding to a moisture increase according to the Clausius-Clapeyron
- relationship for a 2K increase in SST. The bin size is 1 decimal degree.





Figure 6: Composite mean daily rainfall patterns (in mm/day) for the storm days in the top-10%
rainiest TCs in the four GFDL simulations (rows) and in the two southern hemispheric TC basins
(columns). The number of TC storm days used in each composite is given in the panel titles, and
the x and y axes correspond to degrees from the TC center.



Figure 7: As in Figure 4, but for the CMCC model. Note that the color bar extends over twice the





Figure 8: As in Figure 5, but for the CMCC model.



Figure 9: As in Figure 6, but for the CMCC model.



Figure 10: As in Figure 4, but for the CAM5 model. Note that the color bar extends over twicethe range in Figure 4.



Figure 11: As in Figure 5, but for the CAM5 model. Note that 0.5° bins are used instead of the 1°
bins used in Figures 5 and 8.



south Pacific



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Figure 12: As in Figure 6, but for the CAM5 model.