

1
2
3
4
5
6
7
8
9
10
11
12
13
14
15
16
17
18
19
20
21
22
23
24
25
26
27
28
29
30
31
32
33
34
35
36
37
38
39
40

The Two Types of ENSO in CMIP5 Models

Seon Tae Kim and Jin-Yi Yu^{*}
Department of Earth System Science
University of California
Irvine, California, USA

May, 2012
Accepted by *Geophysical Research Letters*

^{*}. *Corresponding author address:* Dr. Jin-Yi Yu, Department of Earth System Science, University of California, Irvine, CA 92697-3100. E-mail: jyyu@uci.edu

ABSTRACT

41

42 In this study, we evaluate the intensity of the Central-Pacific (CP) and Eastern-
43 Pacific (EP) types of El Niño-Southern Oscillation (ENSO) simulated in the pre-
44 industrial, historical, and the Representative Concentration Pathways (RCP) 4.5
45 experiments of the Coupled Model Intercomparison Project Phase 5 (CMIP5). Compared
46 to the CMIP3 models, the pre-industrial simulations of the CMIP5 models are found to
47 (1) better simulate the observed spatial patterns of the two types of ENSO and (2) have a
48 significantly smaller inter-model diversity in ENSO intensities. The decrease in the
49 CMIP5 model discrepancies is particularly obvious in the simulation of the EP ENSO
50 intensity, although it is still more difficult for the models to reproduce the observed EP
51 ENSO intensity than the observed CP ENSO intensity. Ensemble means of the CMIP5
52 models indicate that the intensity of the CP ENSO increases steadily from the pre-
53 industrial to the historical and the RCP4.5 simulations, but the intensity of the EP ENSO
54 increases from the pre-industrial to the historical simulations and then decreases in the
55 RCP4.5 projections. The CP-to-EP ENSO intensity ratio, as a result, is almost the same in
56 the pre-industrial and historical simulations but increases in the RCP4.5 simulation.

57 **1. Introduction**

58 It has been increasingly recognized that two different flavors or types of El Niño-
59 Southern Oscillation (ENSO) occur in the tropical Pacific (e.g., Wang and Weisberg
60 2000; Trenberth and Stepaniak 2001; Larkin and Harrison 2005; Yu and Kao 2007; Ashok
61 et al. 2007; Kao and Yu 2009; Kug et al. 2009). The two types of ENSO are the Eastern-
62 Pacific (EP) type that has sea surface temperature (SST) anomalies centered over the
63 eastern tropical Pacific cold tongue region, and the Central-Pacific (CP) type that has the
64 anomalies near the International Date Line (Yu and Kao 2007; Kao and Yu 2009). In the
65 literature, the non-conventional type of El Niño (i.e., the CP El Niño) has also been
66 referred to as Date Line El Niño (Larkin and Harrison 2005), El Niño Modoki (Ashok et
67 al. 2007), or Warm Pool El Niño (Kug et al. 2009). Several recent observational studies
68 have indicated that the CP El Niño has been intensified in the past three decades (Lee and
69 McPhaden 2010) and that the climate impacts of the CP and EP types of ENSO can be
70 distinctly different. For instance, the impact of the CP ENSO on winter surface air
71 temperatures over the United States was found to be characterized by an east-west dipole
72 pattern rather than the well-known north-south dipole pattern associated with the EP
73 ENSO (Mo 2010). In the Atlantic, the CP El Niño tends to increase the frequency of
74 Atlantic hurricanes, which is opposite to the impact produced by the EP El Niño (Kim et
75 al. 2009). In the Southern Hemisphere, Lee et al. (2010) identified the large impacts of
76 the 2009-10 CP El Niño on the warming in the South Pacific Ocean and west Antarctica
77 and discussed the possible role of the increasing intensity of CP El Niño. Ding et al
78 (2011) also related the west Antarctica warming with the three-decade warming trend in
79 the central equatorial Pacific, which was attributed to increasing intensity and frequency
80 of CP El Niño by Lee and McPhaden (2010). These findings point to a need to examine

81 the different flavors or types of ENSO in the climate models used in the
82 Intergovernmental Panel on Climate Change (IPCC) reports that aim to project future
83 changes in climate variability modes (including ENSO) and their climate impacts.

84

85 The existence of the two types of ENSO has been considered in several studies
86 that evaluated the performance of the coupled climate models from the Coupled Model
87 Intercomparison Project Phase 3 (CMIP3; Meehl et al 2007) in simulating ENSO (e.g.,
88 Yu and Kim 2010; Ham and Kug 2012). Yu and Kim (2010), for example, documented
89 the intensity, ratio, and leading frequency of the EP and CP ENSOs in the CMIP3 pre-
90 industrial simulations and concluded that about nine of the nineteen models realistically
91 simulate the intensity of the two types of the ENSO. Recently, the CMIP5, which include
92 generally higher resolution models and a broader set of experiments relative to CMIP3,
93 has been coordinated to be used in the IPCC Fifth Assessment Reports (Taylor et al.
94 2012). In this study, the two types of ENSO in the CMIP5 models are examined and
95 compared with the CMIP3 models to gauge the improvement in performance from
96 CMIP3 to CMIP5 models. A group of CMIP5 models that realistically simulate these two
97 types of ENSO are then identified and used as the “best model ensemble” to examine
98 changes in the two types of ENSO from the pre-industrial simulation to the historical
99 simulation and the future climate projection. The results obtained in this study indicate
100 that the EP and CP ENSO may not respond in the same way to climate change.

101

102 **2. Data and method**

103 In this study, the two types of ENSO simulated in the pre-industrial, historical,
104 and future projection runs of CMIP5 models are analyzed. For the pre-industrial

105 simulations, a total of twenty CMIP5 models are available for analysis. The names of
106 these models are listed in the legend of Figure 2a. For the future climate projections, we
107 choose to analyze the Representative Concentration Pathways 4.5 (RCP4.5) experiments
108 because more models are available for analysis in this intermediate stabilization scenario.
109 In this scenario, the target radiative forcing near year 2100 is set to be equal to 4.5 Wm^{-2} .
110 Only thirteen of the twenty CMIP5 models provide SST outputs from their pre-industrial,
111 historical, and RCP4.5 simulations. These thirteen models were used in the analysis of
112 the response of the two types of ENSO to changes in atmospheric CO_2 concentrations.
113 These models are indicated by an “*” in the legend of Figure 2a. We analyzed the first
114 200 years of the pre-industrial simulations, roughly the years 1860-2005 of the historical
115 simulations, and roughly the years 2006-2100 of the RCP4.5 projections. The exact
116 lengths of the simulations vary slightly from model to model. The Extended
117 Reconstruction of Historical Sea Surface Temperature version 3 (ERSST V3) data (Smith
118 and Reynolds 2003) are used to provide SST observations for the period 1950-2010.
119 Monthly SST anomalies from the observations and the coupled models are calculated by
120 removing the monthly mean climatology and the trend.

121

122 To identify the two types of ENSO in the CMIP5 coupled models and the
123 observations, we use a combined regression-Empirical Orthogonal Function (EOF)
124 analysis (Kao and Yu 2009; Yu and Kim 2010). We first remove the tropical Pacific SST
125 anomalies that are regressed with the Niño1+2 (0° - 10°S , 80°W - 90°W) SST index and
126 then apply EOF analysis to the remaining (residual) SST anomalies to obtain the SST
127 anomaly pattern for the CP ENSO. Similarly, we subtract the SST anomalies regressed
128 with the Niño4 (5°S - 5°N , 160°E - 150°W) index from the total SST anomalies and then

129 apply EOF analysis to identify the leading structure of the EP ENSO. We remove not
130 only the simultaneous regression but also the regression at lags -3, -2, -1, +1, +2, and +3
131 months using a linear multiple regression method to account for the possible propagation
132 of SST anomalies.

133

134 **3. Results**

135 Figure 1 shows the spatial patterns of the leading EOF modes for the EP and CP
136 types of ENSO obtained by the regression-EOF method from the pre-industrial
137 simulations of the twenty CMIP5 models. In the figure, the loading coefficients for the
138 EOFs are scaled by the square root of their corresponding eigenvalues to represent the
139 standard deviations (STD) of each of the EOF modes. Although discrepancies exist in the
140 detailed realism of the simulated spatial patterns, several models are able to reproduce the
141 observed features of the two types of ENSO, in which the EP type is characterized by
142 SST variability extending from the South American Coast into the central Pacific along
143 the equator and the CP type by SST variability centered in the central tropical Pacific
144 (between 160°W and 120°W) that also extend into the subtropics of both hemispheres.
145 We notice that the observed characteristic of the EP ENSO in which maximum SST
146 variability is located immediately off the South American Coast is well captured by
147 several CMIP5 models (e.g., GFDL-ESM2G, MIROC5, MPI-ESM-LR, MPI-ESM-P),
148 whereas this feature was not as well captured in the CMIP3 models [see Fig. 1 of Yu and
149 Kim (2010)]. The average pattern correlation coefficients between the simulated and
150 observed EP and CP ENSOs for the CMIP5 models are 0.82 and 0.71, respectively. These
151 values are larger than the CMIP3 pattern correlation coefficients (0.75 for the EP ENSO
152 and 0.62 for the CP ENSO). Also, the inter-model deviation of the pattern correlation

153 coefficients is reduced from the CMIP3 to CMIP5 for the CP ENSO (from ± 0.19 to
154 ± 0.13) but about the same for the EP ENSO (from ± 0.17 to ± 0.18).

155

156 Using the scaled EOFs (Fig. 1), we compute the maximum STDs between 10°S -
157 10°N and 120°E - 70°W to quantify the intensities of the two types of ENSO. Figure 2a
158 displays a scatter diagram of the EP versus CP ENSO intensity from the CMIP5
159 simulations. The observed intensities calculated from the ERSST dataset (the gray point)
160 are about 0.7°C for the CP ENSO and 1.0°C for the EP ENSO, indicating that the
161 observed EP ENSO is stronger than the CP ENSO by about 40%. In order to determine
162 which models produce realistically strong EP and CP ENSOs, we use the lower limit of
163 the 95% significance interval of the observed ENSO intensities (using an F-test) as the
164 criteria. The limits turn out to be 0.78°C for the EP ENSO and 0.51°C for the CP ENSO.
165 Based on these criteria, nine of the twenty CMIP5 models (CNRM-CM5, GFDL-ESM-
166 2G, GFDL-ESM2M, GISS-E2-H, HadGEM2-CC, HADGEM2-ES, MPI-ESM-LR, MPI-
167 ESM-P, Nor-ESM1-M) simulate both the EP and CP ENSOs with realistically strong
168 intensities. We also notice that it is more difficult for the models to produce realistically
169 strong EP ENSOs than to produce strong CP ENSOs. Eleven (55%) of the twenty CMIP5
170 models fail to reach the lower intensity limit of the observed EP ENSO, while only 30%
171 of the models fail to reach the limit of the CP ENSO.

172

173 To compare the CMIP5 models' performance to that of the CMIP3 models, a
174 similar scatter plot of the EP and CP ENSO intensities from Yu and Kim (2010) for the
175 CMIP3 models is reproduced here in Figure 2b. We first notice that the percentage of
176 models that can simulate both types of ENSO with realistically strong intensity (i.e.,

177 those models inside the blue squares in Fig. 2) is similar in the CMIP5 models (45%; nine
178 out of the twenty models) and CMIP3 models (47%; nine out of the nineteen models). In
179 this regard, it can be concluded that there are no dramatic differences between these two
180 generations of coupled climate models in the simulation of the two types of ENSO.
181 However, some improvements in the simulations of the two types of ENSO can be
182 identified in the CMIP5 models. Most importantly, the points produced from the CMIP5
183 models (Fig. 2a) are less diverse than those from the CMIP3 models (Fig. 2b). The
184 CMIP3 models are more clearly separated into a group that produces strong ENSO
185 intensities and a group that produces weak ENSO intensities. In CMIP5, the ENSO
186 intensities simulated by the models converge into one single group closer to the
187 observations. A closer inspection reveals that the reduction of the inter-model diversity in
188 the simulated ENSO intensities is particularly significant for the EP type of ENSO. This
189 is demonstrated in Figure 3, where the multi-model means of the ENSO intensities and
190 their inter-model deviations (i.e., the STD) are shown for both the CMIP3 and CMIP5
191 models. The inter-model deviation (indicated by the colored vertical lines in Fig. 3) is
192 decreased in the CMIP5 compared to the CMIP3 models for both ENSO types. In
193 particular, the reduction is much larger for the EP type than for the CP type. The inter-
194 model STD of the EP ENSO intensities is 0.30°C among the CMIP3 models but only
195 0.18°C among the CMIP5 models, which is a statistically significant improvement at the
196 95% level according to an F-test. The reduction of the inter-model difference for the CP
197 ENSO, on the other hand, is less statistically significant (from 0.24 to 0.21). Figure 3 also
198 indicates that the multi-model mean of both the EP and CP ENSO intensities are not very
199 different between CMIP3 and CMIP5 models. In both generations of the CMIP models,
200 the multi-model means of CP ENSO intensity are very close to the observed value

201 (indicated by the dashed-line in the figure), but the multi-model means of the EP ENSO
202 are only about half of the observed intensity. Therefore, though the CMIP5 models have
203 smaller inter-model discrepancies in the simulation of the two types of ENSO, challenges
204 remain in producing a realistically strong EP ENSO in these coupled climate models.

205

206 We next examine the response of two types of ENSO to changes in atmospheric
207 CO₂ concentrations using the thirteen CMIP5 models that provide SST outputs from the
208 pre-industrial, historical, and RCP4.5 runs. Seven of them (CNRM-CM5, GFDL-ESM-
209 2G, GFDL-ESM2M, HadGEM2-CC, HADGEM2-ES, MPI-ESM-LR, and Nor-ESM1-M)
210 are among the nine CMIP5 models that produce strong EP and CP ENSOs. This group of
211 seven models is used to produce the “best model ensemble” for projecting the response of
212 the two types of ENSO to the ongoing and possible future global warming. Figure 4a
213 shows the “best model mean” of the EP and CP intensities and their ratio (CP/EP) in the
214 pre-industrial, historical, and RCP4.5 simulations. The figure shows that the intensity of
215 CP ENSO increases gradually from the pre-industrial simulation to the historical
216 simulation and the RCP4.5 projection, while the intensity of EP ENSO increases from the
217 pre-industrial simulation to the historical simulation but then decreases in the RCP4.5
218 projection. Since the best-model means of the EP and CP ENSO intensities show similar
219 rates of increase from the pre-industrial to historical simulations, the CP-to-EP intensity
220 ratio does not change much between these two runs. On the other hand, a sharp decrease
221 in the EP ENSO intensity and a gradual increase in the CP ENSO intensity result in an
222 increase in the ratio from the historical simulation to the RCP4.5 projection. As shown in
223 Figure 4b, similar tendencies are also found when all the thirteen CMIP5 models are used
224 to calculate the model ensemble means. It is interesting to note that in the RCP4.5

225 warming scenario, the intensity of the CP ENSO will increase to close to 80% (based on
226 the best-model means) or 90% (based on the all-model means) of the EP ENSO intensity.

227

228 **4. Summary and discussion**

229 In this study we assessed the ability of the CMIP5 models in simulating the EP
230 and CP types of ENSO. We find that close to 50% of the CMIP5 models still cannot
231 simulate realistically strong EP and CP ENSOs, as was the case for the CMIP3 models.
232 Furthermore, it is more difficult for the models to reproduce the observed EP ENSO
233 intensity than the observed CP ENSO intensity. However, some encouraging
234 improvements in the simulations of the two types of ENSO were found in the CMIP5
235 models. First of all, the simulated spatial patterns of both types of ENSO in the CMIP5
236 models are improved compared to the CMIP3 models according to a pattern correlation
237 coefficient analysis of the simulated and observed ENSO SST anomalies. Secondly, the
238 inter-model differences in the intensities of the two types of ENSO are reduced among
239 the CMIP5 models relative to the differences among the CMIP3 models. The decrease in
240 the inter-model discrepancies (and hence the improvement in the consistency of model
241 performance) is particularly significant for the simulations of the EP ENSO intensity. We
242 also conclude that the responses of the two types of ENSO to increases in atmospheric
243 CO₂ concentrations are different. The CP ENSO intensity is found to increase gradually
244 from the pre-industrial simulation to the historical simulation and to the RCP4.5
245 projection, while the EP ENSO intensity is found to increase and then decrease during
246 these three climate conditions. However, it should be cautioned that the changes of ENSO
247 intensities from the pre-industrial, historical, to projected simulations are smaller than the

248 standard deviation among the CMIP5 models.

249

250 This study did not examine the cause(s) of the different responses of the two types
251 of ENSO to global warming, which would require an extensive examination of both
252 atmospheric and oceanic processes in the CMIP5 models. This issue is beyond the scope
253 of this paper. It is possible that the different responses imply different generation
254 mechanisms underlying the CP and EP ENSOs. Whereas the EP ENSO shares many
255 characteristics with the canonical ENSO, whose underlying dynamics are known to rely
256 on thermocline variations, the underlying dynamics of the CP ENSO have been suggested
257 to potentially involve forcing from the extratropical atmosphere (Kao and Yu 2009; Yu et
258 al. 2010; Yu and Kim 2011; Kim et al. 2012) and zonal ocean advection in the ocean
259 mixed layer (Kug et al. 2009; Yu et al. 2010). These dynamical processes may be affected
260 differently by global warming and result in the different responses. Further analyses are
261 needed to examine this hypothesis.

262

263 *Acknowledgments.* This research was supported by NOAA-MAPP Grant
264 NA11OAR4310102 and NSF Grant ATM-0925396. The authors thank anonymous
265 reviewers for their valuable comments.

266 **References**

- 267 Ashok K., S. Behera, A. S. Rao, H. Weng, T. Yamagata, 2007: El Niño Modoki and its
268 teleconnection. *J. Geophys Res.*, **112**, C11007, doi:10.1029/2006JC003798.
- 269 Ding, Q, E. J. Steig, D. S. Battisti, and M. Küttel, 2011: Winter warming in West
270 Antarctica caused by central tropical Pacific warming. *Nature Geosci*, **4**, 398-403.
- 271 Ham, Y.-G., and J.-S. Kug, 2012: How well do current climate models simulate two
272 types of El Niño? *Climate Dyn.*, doi:10.1007/s00382-001-1157-3. In press.
- 273 Kao, H.-Y., and J.-Y. Yu, 2009: Contrasting eastern-Pacific and central-Pacific types of
274 El Niño. *J. Climate*, **22**, 615–632.
- 275 Kim, H.-M., P. J. Webster, and J. A. Curry, 2009: Impact of shifting patterns of Pacific
276 Ocean warming on north Atlantic tropical cyclones. *Science*, **325**, 77-80.
- 277 Kim, S. T, J.-Y. Yu, A. Kumar, and H. Wang, 2012: Examination of the two types of
278 ENSO in the NCEP CFS model and its extratropical associations. *Mon. Wea. Rev.*,
279 doi: <http://dx.doi.org/10.1175/MWR-D-11-00300.1>, In press.
- 280 Kug, J.-S., F.-F. Jin, and S.-I. An, 2009: Two types of El Niño events: Cold tongue El
281 Niño and warm pool El Niño. *J. Climate*, **22**, 1499–1515.
- 282 Larkin N. K., D. E. Harrison, 2005: On the definition of El Niño and associated seasonal
283 average U.S. weather anomalies, *Geophys. Res. Lett.*, **32**, L13705,
284 doi:10.1029/2005GL022738.
- 285 Lee, T., and M. J. McPhaden, 2010: Increasing intensity of El Niño in the central-
286 equatorial Pacific. *Geophys. Res. Lett.*, **37**, L14603, doi:10.1029/2010GL044007.
- 287 Lee, T., W. Hobbs, and J. Willis, et al., 2010: Record warming in the South Pacific and
288 western Antarctica associated with the strong central-Pacific El Niño in 2009-10.
289 *Geophys. Res. Lett.*, **37**, L19704, doi:10.1029/2010GL044865.

290 Meehl, G. A. and co-authors, 2007: The WCRP CMIP3 multimodel dataset: A new era in
291 climate change research. *Bull. Amer. Meteor. Soc.*, **88**, 1383-1394.

292 Mo, K., 2010: Interdecadal modulation of the impact of ENSO on precipitation and
293 temperature over the United States. *J. Climate*, **23**, 3639-3656.

294 Smith, T. M., and R. W. Reynolds, 2003: Extended reconstruction of global sea surface
295 temperatures based on COADS data (1854-1997). *J. Climate*, **16**, 1495-1510.

296 Taylor, K. E., R. J. Stouffer, and G. A. Meehl, 2012: An overview of CMIP5 and the
297 experimental design. *Bull. Amer. Met. Soc.*, doi: 10.1175/BAMS-D-11-00094.1, In
298 press.

299 Trenberth, K., and D. P. Stepaniak, 2001: Indices of El Niño evolution. *J. Climate*, **14**,
300 1697–1701.

301 Wang, C., and R. H. Weisberg, 2000: The 1997–98 El Niño evolution relative to previous
302 El Niño Events. *J. Climate*, **13**, 488–501.

303 Yu, J.-Y., and H.-Y. Kao, 2007: Decadal changes of ENSO persistence barrier in SST
304 and ocean heat content indices: 1958–2001. *J. Geophys. Res.*, **112**, 1–10,
305 doi:10.1029/2006JD007654.

306 Yu, J.-Y., and S. T. Kim, 2010: Identification of Central-Pacific and Eastern-Pacific
307 types of El Niño in CMIP3 models. *Geophys. Res. Lett.*, **37**, L15705,
308 doi:10.1029/2010GL044082.

309 Yu, J.-Y., H.-Y. Kao and T. Lee, 2010: Subtropics-related interannual sea surface
310 temperature variability in the equatorial central Pacific. *J. Climate*, **23**, 2869-2884.

311 Yu, J.-Y., and S. T. Kim, 2011: Relationships between extratropical sea level pressure
312 variations and Central-Pacific and Eastern-Pacific types of ENSO. *J. Climate*, **24**,
313 708-720.

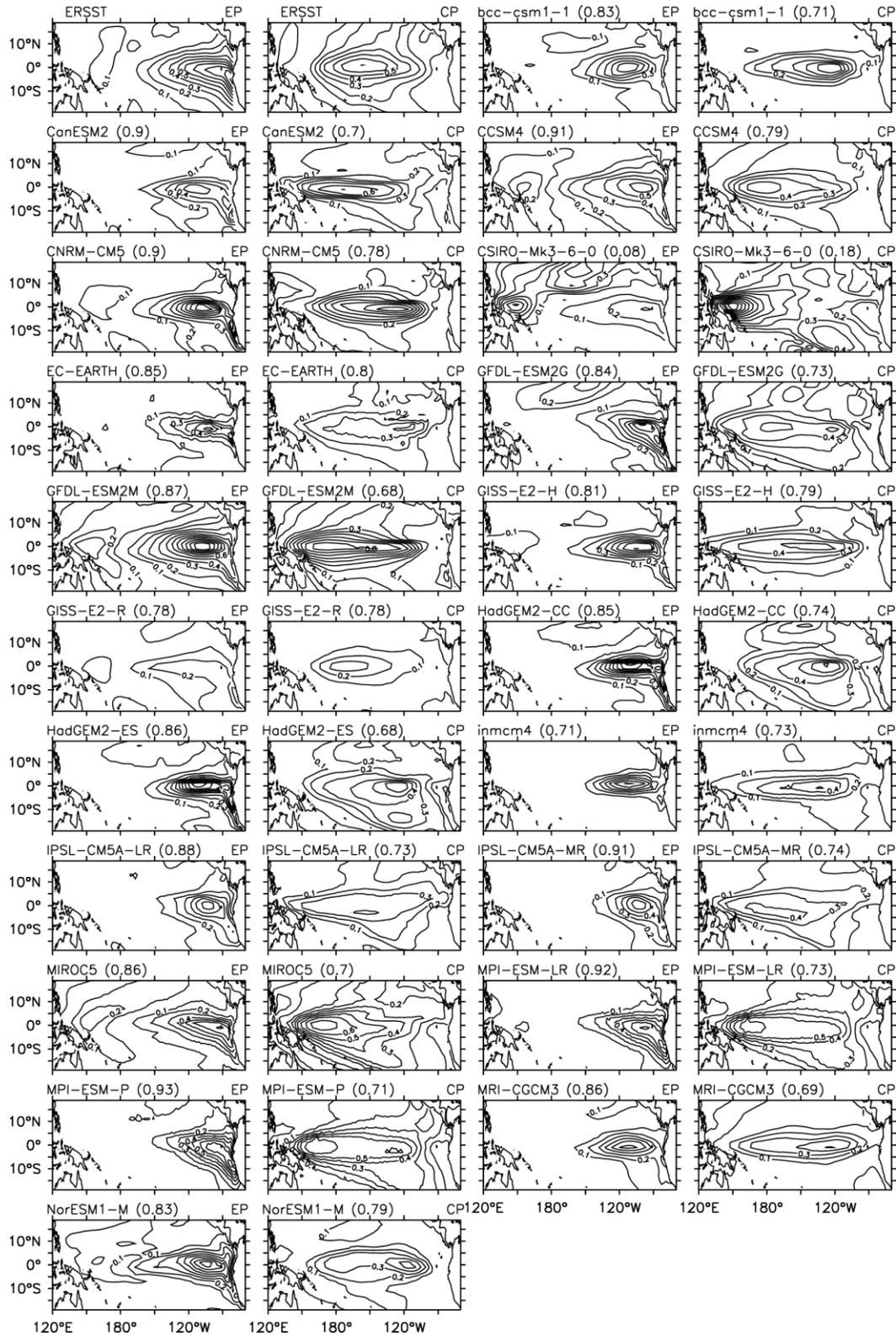
314 **List of Figures**

315 Figure 1. Spatial patterns of the standard deviations of the first EOF mode for the CP
316 ENSO and EP ENSO calculated from observations and 20 CMIP5 models. The
317 observations correspond to the ERSST dataset. Pattern correlations between models
318 and observations are also shown in parentheses.

319 Figure. 2. Scatter plots of maximum standard deviation from (a) CMIP5 and (b) CMIP3
320 models (reproduced from Fig. 2a of Yu and Kim 2010). The blue dashed lines
321 indicate the lower limit of the 95% significance interval of the observed ENSO
322 intensities based on an F-test. The names of the models used in the analyses are
323 provided. The CMIP5 models that provide SST output from all the pre-industrial,
324 historical, and RCP4.5 simulations are indicated by “*”.

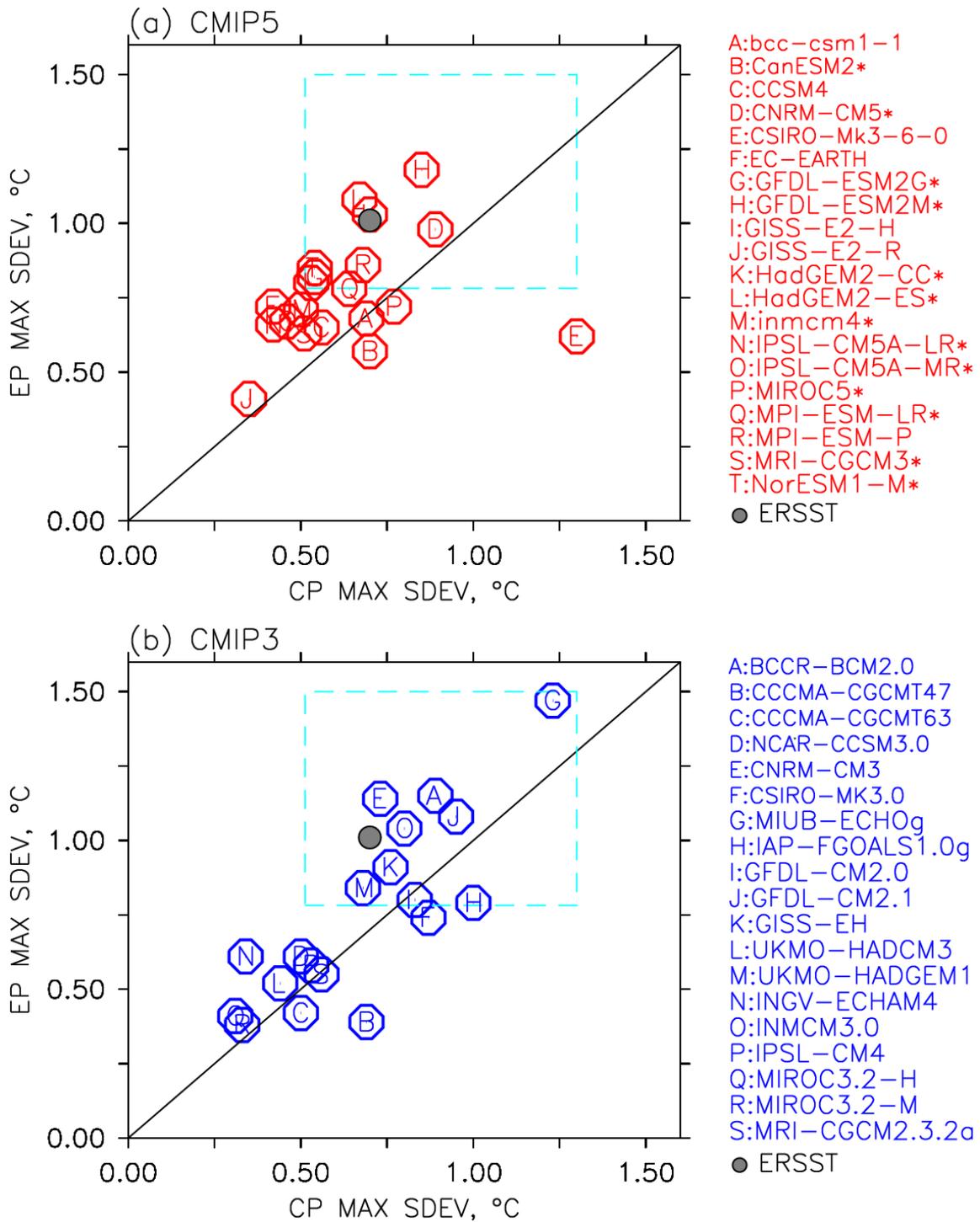
325 Figure 3. The multi-model ensemble mean of the intensities of the two types of ENSO
326 from the CMIP3 models (blue) and the CMIP5 models (red). Inter-model deviations
327 are indicated by vertical lines. The observed intensities are indicated by dashed lines.

328 Figure 4. Multi-model mean of EP and CP intensities and the CP-to-EP ratio from the
329 pre-industrial, historical, and RCP4.5 experiments for (a) the seven 'best' models, and
330 (b) all thirteen models.



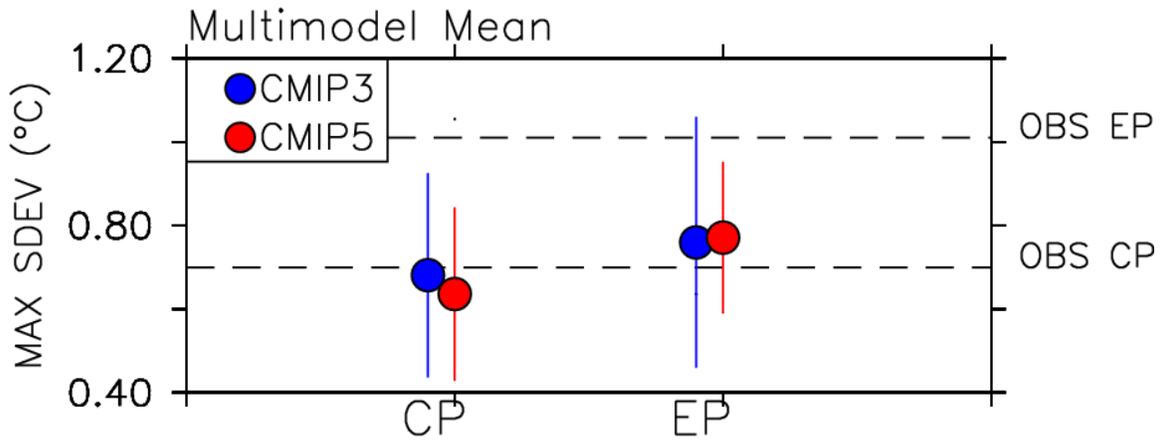
331
332
333
334
335

Figure 1. Spatial patterns of the standard deviations of the first EOF mode for the CP ENSO and EP ENSO calculated from observations and 20 CMIP5 models. The observations correspond to the ERSST dataset. Pattern correlations between models and observations are also shown in parentheses.



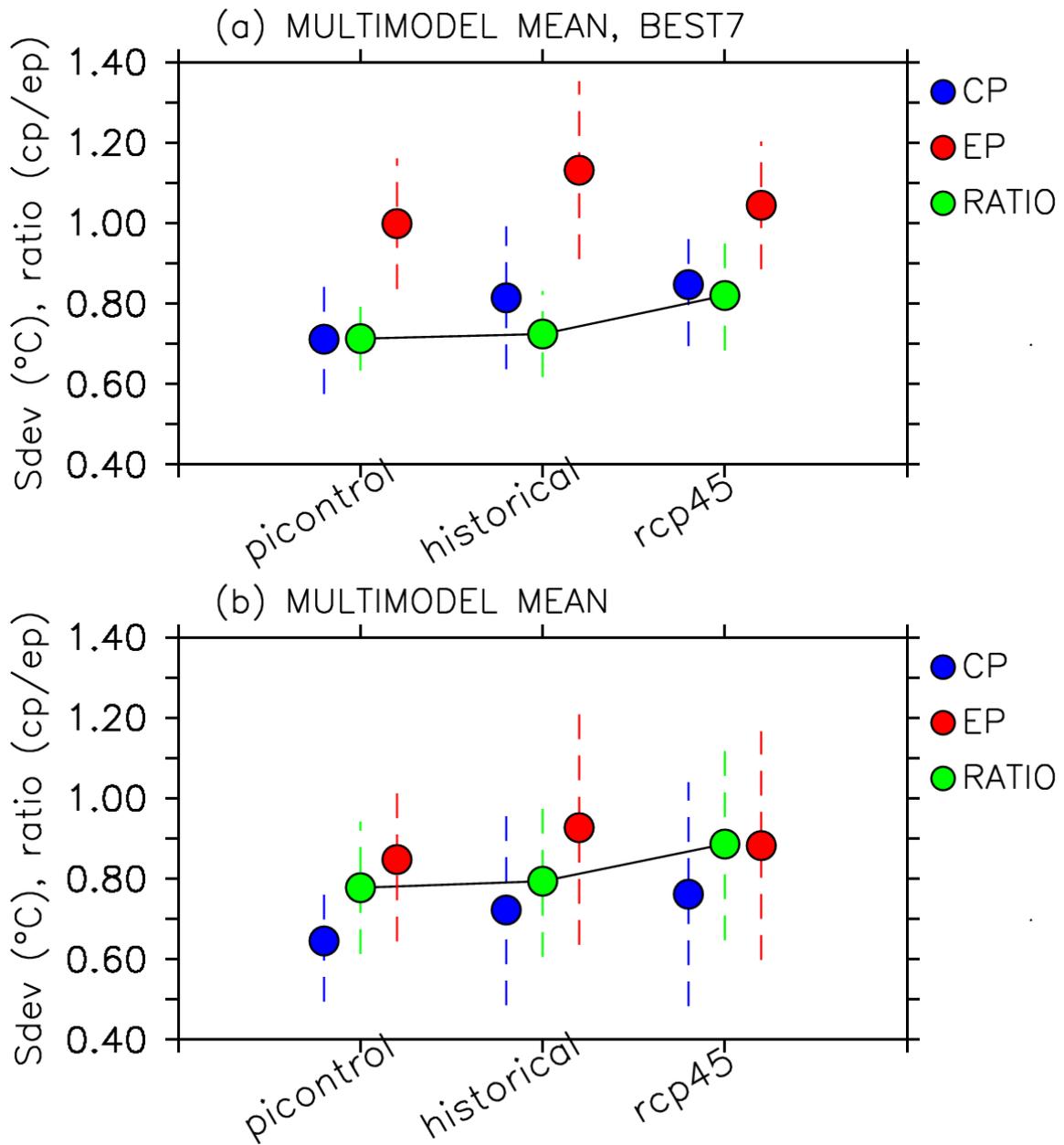
337
 338
 339
 340
 341
 342
 343
 344

Figure 2. Scatter plots of maximum standard deviation from (a) CMIP5 and (b) CMIP3 models (reproduced from Fig. 2a of Yu and Kim 2010). The blue dashed lines indicate the lower limit of the 95% significance interval of the observed ENSO intensities based on an F-test. The names of the models used in the analyses are provided. The CMIP5 models that provide SST output from all the pre-industrial, historical, and RCP4.5 simulations are indicated by “*”.



345
 346
 347
 348
 349

Figure 3. The multi-model ensemble mean of the intensities of the two types of ENSO from the CMIP3 models (blue) and the CMIP5 models (red). Inter-model deviations are indicated by vertical lines. The observed intensities are indicated by dashed lines.



350
 351
 352
 353
 354
 355
 356

Figure 4. Multi-model mean of EP and CP intensities and the CP-to-EP ratio from the pre-industrial, historical, and RCP4.5 experiments for (a) the seven 'best' models, and (b) all thirteen models.