

1 **Aerosol vs. Greenhouse Gas Effects on Tropical Cyclone Potential Intensity**
2 **and the Hydrologic Cycle**

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ABSTRACT

11 Aerosol cooling in the shortwave reduces tropical cyclone (TC) potential
12 intensity (PI) more strongly, by about a factor of two per degree sea surface
13 temperature change, than greenhouse gas warming increases it. This study
14 analyzes single-forcing and historical experiments from the Fifth Coupled
15 Model Intercomparison Project with the goal of a deeper understanding of
16 the physical mechanisms behind this difference. Latent heat flux is used as a
17 proxy for PI, allowing interpretation of PI changes using the surface energy
18 budget. Offline calculations with radiative kernels allow us to estimate what
19 fractions of the surface radiative flux changes can be considered feedbacks
20 due to temperature and water vapor changes. Calculations are carried out
21 for the tropical oceans of each hemisphere (e.g., 0-30N), during the relevant
22 TC seasons. The greater effect of aerosol forcing occurs because shortwave
23 forcing has a greater impact on latent heat flux — and thus also on PI — than
24 does longwave, primarily because of the differences in the direct, temperature-
25 independent component of the surface energy budget response. This result is
26 familiar from prior work on the response of precipitation to radiative forcing,
27 and the essence of the interpretation is similar to that here for PI. We consider
28 only the tropical and seasonal means when studying PI, however, whereas pre-
29 cipitation and the surface energy budget are straightforwardly related only in
30 the global mean. Surface and top-of-atmosphere radiative flux changes with
31 temperature in the two cases (tropical seasonal vs. global annual means) show
32 some quantitatively substantial differences.

33 **1. Introduction**

34 This study addresses the effects of different radiative forcing agents on the potential intensity
35 (PI) of tropical cyclones (TCs). PI is a theoretically-derived quantity (Emanuel 1986, 1995; Bister
36 and Emanuel 1998) that has been shown, with some caveats, to provide a useful upper bound to
37 the actual intensities that TCs can achieve under given environmental conditions (e.g., Bryan and
38 Rotunno 2009a,b). PI also exerts a control on the average intensity of actual TCs even though most
39 do not reach their PI (Emanuel 2000; Wing et al. 2007) (and some may exceed it, e.g., Persing
40 and Montgomery 2003; Hausman et al. 2006; Bryan and Rotunno 2009b; Wang et al. 2014), so
41 that understanding radiative forcing of PI is relevant to understanding how radiative forcing affects
42 actual TC intensities.

43 Several studies have pointed out that the cooling effect of aerosols should reduce PI, TC activity,
44 or both, either over the Atlantic (Mann and Emanuel 2006; Booth et al. 2012; Dunstone et al. 2013;
45 Ting et al. 2015) or globally (Sobel et al. 2016). Inspired by the results of Ting et al. (2015) for
46 the North Atlantic, Sobel et al. (2016) showed that in simulations from the Fifth Coupled Model
47 Intercomparison Project (CMIP5) of the historical period, considering single-forcing (greenhouse
48 gas-only or aerosol-only) experiments as well as those with all natural and anthropogenic forcings,
49 aerosol-only effects were nearly equal and opposite to greenhouse gas-only effects over most of the
50 historical period, so that the net change in PI in the all-forcing experiments (where both forcings
51 are present, and apparently behave approximately linearly) was small — at least until the most
52 recent couple of decades, when greenhouse gas forcing begins to dominate. This is the case even
53 though the greenhouse gas forcing is substantially larger in absolute terms (i.e., in $W m^{-2}$) over
54 the entire period, so that the climate warms continuously. Sobel et al. (2016) interpreted this in
55 light of the results of Emanuel and Sobel (2013), who showed in idealized single-column model

56 (SCM) calculations that imposed changes in the solar constant induce larger changes in PI and
57 precipitation, by approximately a factor of two, than changes in greenhouse gas forcing, when
58 both are measured per degree of sea surface temperature (SST) change. Assuming that the SCM
59 calculations qualitatively represent the physics of the much more comprehensive CMIP5 models
60 well enough for this problem, that solar constant changes are an adequate proxy for aerosol forcing,
61 and that the greenhouse gas forcing exceeds the aerosol forcing in the CMIP5 models by something
62 like a factor of two, the results of Sobel et al. (2016) appear to be broadly consistent with those
63 of Emanuel and Sobel (2013). The physical reasons for the factor of two difference between the
64 impacts of shortwave and longwave forcing on PI, however, remain less than thoroughly explained.
65 In this study, we analyze the same CMIP5 single-forcing experiments in greater detail, with the
66 goal of further clarifying these physical reasons.

67 Our analysis is closely related to recent studies of the global hydrological cycle. Greenhouse gas
68 warming accelerates the earth's hydrologic cycle and aerosol cooling decelerates it. As in the case
69 of PI, aerosols are about two to three times as effective in changing the hydrologic cycle per degree
70 surface temperature change than are greenhouse gases (e.g., Feichter and Roeckner 2004; Liepert
71 and Previdi 2009); this is relevant, for example, to proposed solar radiation management schemes
72 for "geoengineering" (e.g., Bala et al. 2008). Some understanding of this difference has been
73 gained by separating changes in the global energy budget into "fast" or "temperature-independent"
74 and "slow" or "temperature-dependent" components (e.g., Andrews et al. 2009, 2010; O'Gorman
75 et al. 2012; Samset et al. 2016). The temperature-independent radiative effect of a given forcing
76 agent at the top of the atmosphere (TOA), or at the surface, is the change in the TOA or surface
77 radiative flux which would occur in the absence of any changes in the global mean surface tem-
78 perature. In practice, the temperature-independent effect is often estimated as the change which
79 occurs at the very beginning of a simulation in which the radiative forcing agent is switched on

80 abruptly, e.g., using a "Gregory-type" approach (Gregory et al. 2004), or by running a simulation
81 in which the forcing agent is introduced and SSTs are held fixed. The temperature-dependent ef-
82 fect can be estimated as the change in radiative flux at equilibrium (or some other intermediate
83 state in which there has been a finite temperature change) minus the temperature-independent ef-
84 fect. The temperature-dependent effect depends not only on surface temperature, but also on state
85 variables related to it such as atmospheric temperature and water vapor. These influence TOA
86 and surface radiation through feedbacks that have been extensively defined and documented in the
87 literature, such as the water vapor feedback and lapse rate feedback. Studies with single forcings
88 (e.g., Andrews et al. 2009; Previdi 2010; O’Gorman et al. 2012) show that these temperature-
89 dependent feedbacks are similar for different radiative forcings. The temperature-independent
90 effects of shortwave and longwave forcings, on the other hand, are different, and these differences
91 lead to the differences in the hydrologic cycle response.

92 The different effects of shortwave and longwave forcings on the global hydrologic cycle can be
93 understood either from the point of view of the tropospheric heat budget or the surface energy
94 budget. In the global mean, over any time scale of interest for climate studies, the tropospheric
95 heat budget requires that the vertically integrated radiative cooling of the atmosphere be balanced
96 by the sum of latent heating due to water condensation and surface sensible heat flux. To the extent
97 that sensible heat flux is small, then, the radiative cooling closely constrains precipitation (Allen
98 and Ingram 2002).

99 The surface energy budget, on the other hand, requires that the sum of surface latent and sensible
100 heat fluxes balance net surface radiation. To the extent that the surface sensible heat flux is small,
101 surface radiative fluxes constrain precipitation as well since precipitation and surface evaporation
102 must balance in the global mean. While the global mean is essential to make the connection to
103 precipitation, the balance in the surface energy budget itself is local. We show here that PI in the

104 tropics can be understood through similar local surface energy budget arguments, because changes
105 in latent heat flux are good proxies for PI changes. Thus while our analysis bears considerable
106 similarity to those in the hydrologic cycle literature, it differs in our focus on the tropics (that being
107 possible because our arguments do not invoke any global balances), and in particular on individual
108 hemispheres of the tropics during the seasons in which TCs are most active. This changes some of
109 the results quantitatively, and in some respects even qualitatively, from those in the global mean,
110 and we conclude our study with a direct comparison of tropical seasonal and global annual mean
111 results.

112 **2. Models and data**

113 *a. Models*

114 We consider here 11 CMIP5 models that have all the simulations and variables available that
115 are necessary for our analysis. The names of the CMIP5 models, number of ensemble members
116 and duration of each simulation are given in Table 1, and the simulations are described in Taylor
117 et al. (2012). The historical simulations are forced with observed time-varying changes in all
118 natural and anthropogenic forcings. The single forcing simulations that we consider are forced
119 with greenhouse gases (GHG) only and aerosols only. The control simulation is the pre-industrial
120 quasi-equilibrium simulation.

121 The PI is calculated from monthly mean model data, following the definition of Bister and
122 Emanuel (2002), using sea surface temperature, sea level pressure and profiles of temperature and
123 humidity. The net radiative fluxes (shortwave and longwave) at the top of atmosphere and surface
124 were calculated as the difference of the downwelling and upwelling fluxes (i.e. radiative fluxes are
125 positive down), while the surface latent and sensible heat fluxes are positive up.

126 For all variables and models, the monthly climatology is defined by the 1861-1900 ensemble
127 mean of each simulation category (historical, GHG-only or aerosol-only). The pre-industrial cli-
128 matology is defined using 100 years (years 101-200) of one ensemble member of that simulation.
129 The anomalies are calculated by subtracting the monthly climatological values for a given simu-
130 lation from each of the individual ensemble members. The ensemble mean anomalies are defined
131 as the mean of the anomalies over all ensemble members. Seasonal means are defined over the
132 northern hemisphere peak TC season of August - October and the southern TC season of January
133 - March. Area averages in each hemisphere are defined as 0-30N(S). The global means that are
134 shown are also annual means.

135 *b. Radiative Kernels*

136 We compute surface radiative feedbacks due to temperature and water vapor changes in each
137 simulation using the radiative kernel approach (Soden et al. 2008). Feedbacks are thus defined as

$$f_x = \frac{\partial R}{\partial x} \frac{dx}{dT_s} \equiv K_x \frac{dx}{dT_s}, \quad (1)$$

138 where K_x is the radiative kernel quantifying the change in the surface radiation R due to an in-
139 cremental change in the feedback variable x (either surface/atmospheric temperature or specific
140 humidity), and dx and dT_s are the changes in the feedback variable and the tropical mean SST
141 over the course of the simulation. We employ the radiative kernels of Previdi (2010) and Previdi
142 and Liepert (2012) that were computed using an offline version of the radiation code from the
143 ECHAM5 general circulation model. The climate response dx is calculated in each simulation as
144 the difference in the monthly climatology between the periods 1861-1900 and 1981-2005, and is
145 regridded to the ECHAM5 grid in order to have the same dimensions as the radiative kernels. The
146 tropical mean SST change is the change between the same two time periods. In the results that

147 follow, we present atmospheric temperature and water vapor feedbacks that have been vertically
148 integrated from the surface to the tropopause, which is taken to be 100 hPa at the equator, increas-
149 ing linearly to 300 hPa at the poles. These vertically-integrated feedbacks thus represent the net
150 effect of tropospheric column temperature and water vapor changes on the surface radiation.

151 It is worth noting that since the simulations we analyze include time-varying radiative forcing,
152 and no fixed SST simulations are available for this set of CMIP5 experiments, we are unable to
153 separate the total changes in tropospheric temperature and water vapor occurring in the simulations
154 into fast and slow components. Thus, the tropospheric temperature and water vapor feedbacks that
155 we consider include the effects of any adjustments in these variables that result from the imposed
156 forcing over the course of the simulations.

157 **3. Results**

158 Fig. 1 shows multi-model mean time series of PI and SST for the northern hemisphere tropics
159 from four sets of simulations: historical (all forcings), greenhouse gas-only, aerosol-only, and pre-
160 industrial control. We see that the PI changes in the aerosol-only and greenhouse gas-only runs are
161 approximately equal and opposite, while those in the historical runs — apart from the influence
162 of several volcanoes, which appear as negative excursions lasting a few years — show little trend,
163 at least until the last few decades. In SST, the increases in the greenhouse gas-only simulations
164 clearly exceed in magnitude the decrease in the aerosol-only simulations by about a factor of
165 two, and the historical simulations show an increasing trend over the whole 20th century, though
166 disrupted somewhat by several volcanoes late in the century. These results show, consistently with
167 Sobel et al. (2016) and Emanuel and Sobel (2013), that the aerosol influence on PI per degree SST
168 change exceeds that of greenhouse gases by approximately a factor of two. Individual models, as

169 might be expected, produce noisier time series, and some range in their responses to the forcings
 170 (not shown), but do not overall change our impression derived from the multi-model mean.

171 Fig. 2 shows scatter plots produced from the multi-model mean data, averaged in the same
 172 way as in Fig. 1; each point is a different time from the time series. Fig. 2a and 2b scatter
 173 SST against PI for August-September-October (ASO) and January-February-March (JFM), and
 174 show, as expected, a slope greater in the aerosol-only simulation than the greenhouse gas-only
 175 simulation, by about a factor of 2.5.

176 Figs. 3a-b scatter PI against latent heat flux, and show that the relationships between these two
 177 variables are approximately the same for the aerosol-only and greenhouse gas-only experiments,
 178 unlike in the SST-PI case shown in Fig. 2. According to theory, PI can be computed as a function
 179 of the thermal disequilibrium at the surface:

$$V^2 = \frac{T_s - T_o}{T_o} \frac{C_k}{C_D} (k^* - k), \quad (2)$$

180 where V is the PI, T_s is the SST, T_o is the outflow temperature, C_k and C_D are bulk exchange coef-
 181 ficients for heat and momentum, and k^* and k are the saturation moist enthalpy of the surface and
 182 the actual enthalpy of near-surface air respectively. Equation (2) comes from Bister and Emanuel
 183 (1998) and includes the effect of dissipative heating, so that the denominator contains T_o rather
 184 than T_s . To understand Fig. 3, however, it does not matter exactly what the factor multiplying the
 185 enthalpy difference is. We may simply write

$$V^2 = c(k^* - k) \quad (3)$$

186 where

$$c = \frac{T_s - T_o}{T_o} \frac{C_k}{C_D},$$

187 and imagine that changes in SST, outflow temperature, and the exchange coefficients with climate
 188 are small, so that c is approximately constant. In that case, PI changes should be controlled by

189 air-sea disequilibrium changes. Further, if surface wind speed changes are also small, then air-
 190 sea disequilibrium changes should be proportional to surface turbulent heat flux changes, since
 191 those also are proportional to air-sea disequilibrium. If the dominant contribution to the enthalpy
 192 difference $k^* - k$ is the latent component, $l_v(q^* - q)$, with q specific humidity and l_v enthalpy of
 193 vaporization, with the component related to the temperature difference being small, or the two
 194 components can be considered to be proportional to one another, then we can write the latent heat
 195 flux E as

$$E \approx d(k^* - k)$$

196 where the coefficient d contains the surface wind speed as well as an exchange coefficient. Thus
 197 if the wind speed can also be assumed constant, we can write

$$V^2 \approx \gamma E, \tag{4}$$

198 where $\gamma = c/d$. If we consider small perturbations, as in Fig. 3, we can linearize (4) to obtain

$$E' \approx \frac{2\bar{E}}{\bar{V}} V', \tag{5}$$

199 where V' and E' are the perturbations about basic state values \bar{V} and \bar{E} , and we have eliminated γ
 200 by noting that $\gamma = \bar{V}^2/\bar{E}$.

201 The linear relationships and similar slopes in the aerosol-only and greenhouse gas-only exper-
 202 iments suggest that the assumptions used to arrive at (5) are valid to a degree of approximation
 203 good enough to be useful for our purpose. We can go one step further, though, and compare the
 204 slope itself to the theoretical prediction. The slopes in Fig. 3a are around $2 \text{ W m}^{-3} \text{ s}$ (or W m^{-2}
 205 per m s^{-1}), consistent with mean values $\bar{E}/\bar{V} \approx 1 \text{ W m}^{-3} \text{ s}$. This is somewhat consistent with the
 206 mean values of latent heat flux and PI computed from the CMIP5 data, but not precisely so. Do-
 207 main average values in our northern hemisphere tropical averaging region are 67.4 m s^{-1} for PI

208 and 109.3 W m^{-2} for latent heat flux, and 57.9 m s^{-1} and 116.6 W m^{-2} in the southern hemi-
209 sphere tropics, giving ratios $\overline{E}/\overline{V}$ around a factor of two larger than our analysis based on Fig. 3a
210 suggests. We suspect this quantitative difference is due to averaging within the large areas over
211 different locations where both PI and surface wind speed vary. We have not attempted to diagnose
212 this further.

213 Analyses of the SST-PI and latent heat flux-PI slopes from the individual models (Fig. 4) further
214 show that the GHG vs. aerosol differences in the former case are much larger and more consistent
215 than those in the latter. The relationship between latent heat flux and PI is similar across sim-
216 ulations with different forcings, whereas the relationship between SST and PI shows consistent
217 differences between GHG- and aerosol-forced simulations, differences which are our subject here.
218 Considering this and the evidence from Fig. 3, combined with the qualitative agreement with the-
219 ory, we conclude that it is valid to use the latent heat flux as a proxy for PI for the purpose of
220 explaining the difference in the response of PI to aerosols and greenhouse gases. If we can explain
221 the different relationships between latent heat flux and SST between the aerosol-only and green-
222 house gas-only experiments, then, we can take that to be an adequate explanation of the different
223 relationships between PI and SST as well.

224 The neglect of surface wind speed changes is a caveat on the theoretical interpretation, given
225 that such changes induce larger changes in PI for a given SST change than do surface radiative
226 flux changes (Emanuel and Sobel 2013). But the empirical relationship between latent heat flux
227 and PI on its own justifies using latent heat flux, and thus the surface energy budget overall, to
228 interpret PI responses to radiative forcing, even if the simple theory above does not explain the
229 relationship quantitatively. To the extent that surface wind speeds may change, we can think of
230 PI changes as having a component due to radiative forcings and another component due to wind
231 speed. Our study here aims to explain only the former.

232 Figs. 5a-h show analogous scatter plots of terms in the surface energy budget — latent heat
233 flux, sensible heat flux, longwave radiative flux, and shortwave radiative flux — vs. SST, for both
234 the northern and southern hemisphere tropics in the respective TC seasons. The conventions are
235 such that the latent and sensible heat fluxes are defined positive up, while the radiative fluxes are
236 defined positive down. Thus in perfect energy balance, the sum of sensible and latent fluxes would
237 equal the sum of the radiative fluxes. The slopes derived from linear regression do not balance
238 in this way; there is an imbalance of $\sim 1.1 \text{ W m}^{-2} \text{ K}^{-1}$ for the GHG case and $0.9 \text{ W m}^{-2} \text{ K}^{-1}$
239 for the aerosol case in the northern hemisphere for ASO, with the corresponding numbers being
240 0.6 and $2.2 \text{ W m}^{-2} \text{ K}^{-1}$ for the southern hemisphere in JFM . This may be due to changes in the
241 seasonal cycle - as these are seasonal rather than annual means (e.g., Sobel and Camargo 2011)
242 or changes in ocean heat transport, or imprecision resulting from the regression analysis. In any
243 case, however, the substantial difference in the latent heat flux – SST relationship between the
244 aerosol and greenhouse gas experiments is well explained qualitatively, and to a reasonable extent
245 even quantitatively, by the difference in the radiative terms in those experiments. Summing the
246 slopes from the radiative terms gives $\sim 7 \text{ W m}^{-2} \text{ K}^{-1}$ for the aerosol vs. $2.5 \text{ W m}^{-2} \text{ K}^{-1}$ for the
247 GHG experiments, while the sum of the latent and sensible heat flux slopes is $\sim 5 \text{ W m}^{-2} \text{ K}^{-1}$
248 for the aerosol vs. $\sim 1.5 \text{ W m}^{-2} \text{ K}^{-1}$ for the GHG experiment. A similar degree of agreement is
249 obtained for the historical experiments as well, though the scatter is greater and there is much more
250 cancellation between the two radiative terms. This is roughly consistent with our expectation that
251 the historical experiments can be thought of as a linear sum of the aerosol and GHG experiments.
252 Focusing on the difference between the aerosol and GHG results, we see that the longwave flux
253 into the ocean increases slightly more slowly with SST for the aerosol than the GHG forcing in
254 the northern hemisphere (though not the southern). The difference in the shortwave is much more
255 dramatic, with the shortwave flux into the ocean increasing strongly with SST for the aerosol

256 experiment while it decreases weakly in the GHG experiment, perhaps due to increased shortwave
257 absorption by water vapor.

258 Fig. 6 shows feedbacks computed from the radiative kernels from the ensemble means of the
259 three sets of experiments, labeled as in the previous figures. Each of the first three columns shows
260 the changes in surface radiative fluxes — longwave, shortwave, and net or the sum of shortwave
261 and longwave (top, middle, and bottom rows respectively) — computed from the changes in a
262 single input variable. The first column shows changes due to surface temperature only, while
263 the second and third show changes due to atmospheric temperature and humidity changes only.
264 The last column shows the sum of all three components, giving the kernels estimates of the total
265 changes in surface radiative fluxes resulting from temperature and water vapor changes.

266 In Fig. 7 we separate the direct response to radiative forcing agents (greenhouse gases and
267 aerosols) from the feedbacks that result from changes to the climate via surface temperature, at-
268 mospheric temperature and atmospheric humidity, using the kernel calculations shown in Fig. 6 to
269 estimate the feedbacks. All quantities shown are values from the late historical period (1981-2005)
270 minus those in the early historical period (1861-1900). Each diamond-shaped symbol indicates
271 changes in SST (horizontal axis) and net latent plus sensible heat flux (vertical axis) for a single
272 model, with colors indicating different experiments as above. The slopes of the lines connecting
273 these multi-model means (solid diamonds) to the origin can be interpreted similarly to the slopes
274 of the scatter plots in Fig. 5. The circles indicate what the changes in latent plus sensible heat flux
275 would be if they were assumed to be equal and opposite to the radiative flux changes inferred from
276 the kernels. That is, we assume in this figure both that the kernels accurately capture the feedbacks
277 due to temperature and humidity changes and that the ocean mixed layer is in equilibrium so that
278 the changes in radiative fluxes are exactly balanced by changes in turbulent fluxes. Under these

279 assumptions, the differences between the circles and the diamonds represent the direct effects of
280 the radiative forcings.

281 We see from Fig. 7 that not only are the changes in surface turbulent heat fluxes per degree SST
282 change considerably larger for aerosol-only than greenhouse gas-only experiments, but even more
283 so, the components of those changes that we infer to be directly radiatively forced — the difference
284 between the total and the feedback, diamond minus circle — is as well. The feedbacks, on the other
285 hand — apparent here as the slopes of the lines connecting the circles to the origin — are similar
286 between the multi-model means of the greenhouse gas-only and aerosol-only experiments, at least
287 in the northern hemisphere. (In the southern hemisphere, the feedbacks in the aerosol case are
288 mostly consistent with those in the greenhouse gas case, but the multi-model mean is strongly
289 influenced by one extreme outlier.) We interpret the directly forced change as being required by
290 the need for the surface turbulent heat flux to balance the surface radiative flux change that results
291 from the aerosols or greenhouse gases alone; this is referred to as the temperature independent
292 component of the climate response in many studies of the global hydrologic cycle (Andrews et
293 al. 2009, O’Gorman et al. 2012). That this component is larger for shortwave (aerosol) than
294 longwave (greenhouse gas) forcings is consistent with those studies, as is the similarity in the
295 temperature-dependent feedbacks, though these prior studies consider global and annual means
296 while we consider changes over the tropical oceans of single hemispheres in single seasons.

297 To make a closer connection to the literature on the global hydrologic cycle, Figs. 8 and 9 are
298 analogous to Figs. 5 and 7 except that they show global and annual means.

299 The results in Figs. 8 and 9 bear some qualitative similarity to those in Figs. 5 and 7, particularly
300 in that the total turbulent flux changes per degree SST are larger for aerosol than greenhouse gas
301 forcing. They are quantitatively different, however. Comparing the scatter plots of latent heat flux
302 vs. SST, the ratio of the slope in the aerosol case to that in the greenhouse gas case is similar

303 in the tropics and globally, on the order of a factor of two in both cases, but both slopes are
304 substantially larger — again by factors between two and three — in the tropical case vs. the
305 global mean. Examination of the radiative fluxes indicates this to be largely a consequence of
306 much larger changes in the tropics than globally, both in the longwave and shortwave. In the
307 case of the shortwave, the differences in the aerosol and greenhouse gas cases between the tropics
308 and globally are not individually as large as are the changes in the longwave, but the difference
309 between the aerosol and greenhouse gas changes is again larger by about a factor of two in the
310 tropics than globally.

311 Finally, in the interest of understanding the similarities and differences between the global and
312 tropical responses to different radiative forcing agents further, Fig. 10 shows changes in the TOA
313 radiative fluxes, in the same format as figs. 5 and 8, both for the tropics and globally. As above,
314 our sign convention is that all fluxes are positive down.

315 Fig. 10e shows that in the aerosol experiments, TOA infrared decreases with SST in the global
316 mean, consistent with dominance of the Planck and lapse rate feedbacks over the increasing green-
317 house effect associated with increasing water vapor. Net TOA radiation increases slightly with
318 SST, consistent with the SST changes being radiatively forced, due to shortwave TOA flux in-
319 creases slightly exceeding longwave decreases. This is true as well, though with quantitatively
320 smaller slopes for both longwave and shortwave, in the greenhouse gas experiments (Fig. 10e,f):
321 longwave flux decreases with SST while shortwave increases slightly more. That the net TOA
322 longwave change is negative even in these experiments, where increases in greenhouse gas con-
323 centrations are unquestionably the ultimate cause of the warming, may seem counterintuitive, but
324 has been explained previously (Trenberth and Fasullo 2009; Donohoe et al. 2014).

325 Comparing Figs. 10a and 10c with 10e, in the aerosol case we see much greater scatter in the
326 tropics than globally, and in the northern hemisphere, a much smaller slope, suggesting that the

327 water vapor feedback is more competitive with the Planck and lapse rate feedbacks in that case. In
328 the greenhouse gas experiments, the slopes become clearly positive in the tropics; the water vapor
329 feedback combined with the direct radiative forcing from increasing greenhouse gases dominates.
330 In the shortwave, tropical and global results (Figs. 10b, 10d compared with 10f) show less distinct
331 differences apart from greater scatter in the tropics.

332 **4. Comment on temperature dependence**

333 The CMIP5 results here and in Sobel et al. (2016) appear at first glance consistent with those
334 of Emanuel and Sobel (2013) in that shortwave forcing has a greater influence than longwave
335 forcing on PI per degree SST change. However, close inspection of Fig. 2 in Emanuel and Sobel
336 (2013) shows that, in their radiative-convective equilibrium calculations, the difference emerges
337 only around an SST of around 29°C, higher than the mean values over the regions of interest
338 here. We expect the difference between shortwave and longwave forcings to become greater at
339 sufficiently high SST, since at sufficiently high SST the net surface longwave flux will approach
340 zero as the atmospheric boundary layer becomes very opaque in the longwave while the SST and
341 near-surface atmospheric temperatures are nearly equal. Then further increases in greenhouse
342 gases will have no effect at the surface, and all temperature-dependent longwave feedbacks will
343 approximately vanish there for any forced climate change, while changes in shortwave will still
344 have a substantial temperature-independent effect (though muted somewhat by absorption in the
345 troposphere). This is seen in simulations of precipitation changes in response to changes in tro-
346 pospheric longwave opacity (representing concentrations of all greenhouse gases including water
347 vapor) over a wide range of climates in an intermediate complexity global model (O’Gorman and
348 Schneider 2008), where precipitation increases with global mean surface temperature saturate at
349 high temperatures.

350 We interpret the greater sensitivity to aerosols than greenhouse gases in the CMIP5 simulations
351 shown above as being due to qualitatively the same physics as occurs in the higher-temperature
352 regime in Emanuel and Sobel (2013) and (with the caveat again that ours are tropical rather than
353 global results, making quantitative comparison more difficult) O’Gorman and Schneider (2008).
354 Although the difference is manifest at lower SST here than in Emanuel and Sobel (2013), the
355 precise SST at which it should emerge is expected to depend on the details of radiative transfer
356 in both the longwave and shortwave (the latter since shortwave absorption is not negligible) and
357 how both scale with surface temperature. These may differ in different models and experimental
358 designs, all of which are substantially different between the studies described in this section. More
359 detailed study of the surface energy budget’s different responses to warming as they depend on
360 these details would be valuable.

361 **5. Conclusions**

362 We have analyzed single-forcing and historical CMIP5 experiments in order to understand the
363 greater influence of aerosols compared to greenhouse gases on the potential intensity (PI) of trop-
364 ical cyclones (TCs). We analyzed sea surface temperature (SST), PI, and terms in the surface
365 energy budget over the tropical ocean regions and seasons most conducive to TCs. Our primary
366 conclusions are as follows:

- 367 1. The variation of latent heat flux with PI is quantitatively similar between aerosol-only and
368 greenhouse gas-only experiments, whereas both PI and latent heat flux vary more strongly
369 with SST, by a factor of two or more, in aerosol-only experiments than in greenhouse gas-
370 only experiments. Thus latent heat flux can be used as a proxy for PI, as we expect from
371 theory if wind speed changes are small. This allows us to use the surface energy budget to
372 understand PI changes.

- 373 2. Aerosols have a stronger influence than greenhouse gases because they act primarily in the
374 shortwave part of the electromagnetic spectrum while greenhouse gases act in the longwave.
- 375 3. Calculations with offline radiative kernels indicate that the temperature-dependent feedbacks
376 resulting from both temperature and humidity changes are similar between aerosol-only and
377 greenhouse gas-only experiments. This is true in both the longwave and shortwave. Thus the
378 difference between aerosol and greenhouse gas forcings is due to the difference in the direct,
379 temperature-independent effects of the radiative forcing agents themselves.
- 380 4. Our results are in most respects qualitatively similar to those from prior studies on the global
381 hydrological cycle. Our analysis differs from those prior ones, however, in that we analyze
382 means over the tropics of a single hemisphere in a single season, as opposed to the global
383 and annual means used in most studies of the hydrologic cycle. Precipitation can be straight-
384 forwardly related to radiative quantities only in the global mean, whereas the relationship
385 between latent heat flux and PI, and between latent heat flux and the other terms in the sur-
386 face energy budget, is local as long as the ocean mixed layer is in an appropriately defined
387 equilibrium on the time scales of interest. Comparison of tropical seasonal results to global
388 annual results for the same CMIP5 experiments, at both the surface and top of atmosphere,
389 shows a number of quantitative differences and even some qualitative ones. As an example,
390 while the net top of atmosphere longwave radiation decreases with SST globally in the GHG
391 experiments (so that the warming is driven by shortwave radiation changes despite the ulti-
392 mate cause being greenhouse gases, as found by prior studies), it increases with SST in the
393 tropics.
- 394 5. Results from historical simulations containing all natural and anthropogenic forcings are com-
395 plex, with greater scatter in the relationships between the different quantities analyzed here,

396 and in some respects not obviously predictable a priori from the single-forcing experiments.
397 In general they resemble the greenhouse gas-only experiments more than the aerosol-only ex-
398 periments, as perhaps might be expected since the greenhouse gas forcing is generally larger
399 than the aerosol forcing over the period simulated. The latent heat flux and PI changes, how-
400 ever, are smaller than in the single-forcing experiments, due to the cancellation between the
401 forcings that motivated this study.

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405 **References**

- 406 Allen, M. R., and W. J. Ingram, 2002: Constraints on future changes in climate and the hydrologic
407 cycle. *Nature*, **419**, 224–232.
- 408 Andrews, T., P. M. Forster, and J. M. Gregory, 2009: A surface energy perspective on climate
409 change. *J. Climate*, **22**, 2557–2570.
- 410 Bala, G., P. B. Duffy, and K. E. Taylor, 2008: Impact of geoengineering schemes on the global hy-
411 drological cycle. *Proceedings of the National Academy of Sciences*, **105 (22)**, 7664–7669, doi:
412 10.1073/pnas.0711648105, URL <http://www.pnas.org/content/105/22/7664>, <http://www.pnas.org/content/105/22/7664.full.pdf>.
- 414 Bister, M., and K. A. Emanuel, 1998: Dissipative heating and hurricane intensity. *Meteor. Atmos.*
415 *Phys.*, **50**, 233–240,.

416 Bister, M., and K. A. Emanuel, 2002: Low frequency variability of tropical cyclone
417 potential intensity 1. Interannual to interdecadal variability. *J. Geophys. Res.*, **107**,
418 doi:10.1029/2001JD000776,.

419 Booth, B. B. B., N. J. Dunstone, P. R. Halloran, T. Andrews, and N. Bellouin, 2012: Aerosols
420 implicated as a prime driver of twentieth-century North Atlantic climate variability. *Nature*,
421 doi: :10.1038/nature10946.

422 Bryan, G. H., and R. Rotunno, 2009a: Evaluation of an analytical model for the maximum inten-
423 sity of tropical cyclones. *J. Atmos. Sci.*, **66**, 3042–3060.

424 Bryan, G. H., and R. Rotunno, 2009b: The maximum intensity of tropical cyclones in axisymmet-
425 ric numerical model simulations. *Mon. Wea. Rev.*, **137**, 1770–1789.

426 Donohoe, A., K. C. Armour, A. G. Pendergrass, and D. S. Battisti, 2014: Radiative feed-
427 backs on global precipitation. *Proc. Nat. Acad. Sci.*, **111**, 16700–16705, doi:10.1007/
428 s00382-014-2308-0.

429 Dunstone, N. J., D. M. Smith, B. B. B. Booth, L. Hermanson, and R. Eade, 2013: An-
430 thropogenic aerosol forcing of Atlantic tropical storms. *Nature Geosci.*, **6**, 534–539, doi:
431 doi:10.1038/Ngeo1854.

432 Emanuel, K. A., 1986: An air-sea interaction theory for tropical cyclones. Part I: Steady mainte-
433 nance. *J. Atmos. Sci.*, **43**, 585–604.

434 Emanuel, K. A., 1995: The behavior of a simple hurricane model using a convective scheme based
435 on subcloud-layer entropy equilibrium. *J. Atmos. Sci.*, **52**, 3960–3968.

436 Emanuel, K. A., 2000: A statistical analysis of tropical cyclone intensity. *Mon. Wea. Rev.*, **128**,
437 1139–1152.

- 438 Emanuel, K. A., and A. H. Sobel, 2013: Response of tropical sea surface temperature, precipita-
439 tion, and tropical cyclone-related variables to changes in global and local forcing. *J. Adv. Model.*
440 *Earth Sys.*, **5**, 447–458.
- 441 Feichter, J., and E. Roeckner, 2004: Nonlinear aspects of the climate response to greenhouse gas
442 and aerosol forcing. *J. Climate*, **17**, 2384–2398.
- 443 Gregory, J. M., and Coauthors, 2004: A new method for diagnosing radiative forcing and climate
444 sensitivity. *Geophys. Res. Lett.*, **31**, doi:10.1029/2003GL018747.
- 445 Hausman, S. A., K. V. Ooyama, and W. H. Schubert, 2006: Potential vorticity structure of simu-
446 lated hurricanes. *J. Atmos. Sci.*, **63**, 87–108, doi:10.1175/JAS3601.1.
- 447 Liepert, B. G., and M. Previdi, 2009: Do models and observations disagree on the rainfall response
448 to global warming? *J. Climate*, **22**, 3156–3166.
- 449 Mann, M. E., and K. A. Emanuel, 2006: Atlantic hurricane trends linked to climate change. *EOS*,
450 **71**, doi:10.1029/2006EO240001.
- 451 O’Gorman, P., and T. Schneider, 2008: The hydrological cycle over a wide range of climates
452 simulated with an idealized GCM. *J. Climate*, **21**, 524–535.
- 453 O’Gorman, P. A., R. P. Allan, M. P. Byrne, and M. Previdi, 2012: Energetic constraints on precip-
454 itation under climate change. *Surv. Geophys.*, **33**, 585–608, doi:10.1007/s10712-011-9159-6.
- 455 Persing, J., and M. T. Montgomery, 2003: Hurricane superintensity. *J. Atmos. Sci.*, **60**, 2349–2371.
- 456 Previdi, M., 2010: Radiative feedbacks on global precipitation. *Environ. Res. Lett.*, **5**, 025 211.
- 457 Previdi, M., and B. G. Liepert, 2012: The vertical distribution of climate forcings and feedbacks
458 from the surface to top of atmosphere. *Climate Dyn.*, **39**, 941–951.

- 459 Samset, B. H., and coauthors, 2016: Fast and slow precipitation responses to individual climate
460 forcers: A PDRMIP multimodel study. *Geophys. Res. Lett.*, **43**, doi:10.1002/2016GL068064.
- 461 Sobel, A. H., and S. J. Camargo, 2011: Projected future seasonal changes in tropical summer
462 climate. *Journal of Climate*, **24** (2), 473–487.
- 463 Sobel, A. H., S. J. Camargo, T. M. Hall, C.-Y. Lee, M. K. Tippett, and A. A. Wing, 2016: Human
464 influence on tropical cyclone intensity. *Science*, **353**, 242–246, doi:10.1126/science.aaf6574.
- 465 Soden, B. J., I. M. Held, R. Colman, K. M. Shell, J. T. Kiehl, and C. A. Shields, 2008: Quantifying
466 climate feedbacks using radiative kernels. *J. Climate*, **21**, 3504–3520.
- 467 Taylor, K. E., R. J. Stouffer, and G. A. Meehl, 2012: An overview of CMIP5 and the experiment
468 design. *Bull. Amer. Meteor. Soc.*, **93**, 485–498.
- 469 Ting, M., S. J. Camargo, C. Li, and Y. Kushnir, 2015: Natural and forced North Atlantic hur-
470 ricane potential intensity change in CMIP5 models. *J. Climate*, **28**, 3926–2942, doi:10.1175/
471 JCLI-D-14-00520.1.
- 472 Trenberth, K. E., and J. T. Fasullo, 2009: Global warming due to increasing absorbed solar radia-
473 tion. *Geophys. Res. Lett.*, **36**, doi:10.1029/2009GL037527.
- 474 Wang, S., S. J. Camargo, A. H. Sobel, and L. M. Polvani, 2014: Impact of the tropopause temper-
475 ature on the intensity of tropical cyclones: An idealized study using a mesoscale model. *Journal*
476 *of the Atmospheric Sciences*, **71** (11), 4333–4348.
- 477 Wing, A. A., A. H. Sobel, and S. J. Camargo, 2007: The relationship between the potential and
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481 riod of the simulations used in our analysis. Information on the CMIP5 models
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484 tologies are based on the ensemble mean 1861-1900 average, for the historical,
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491 for the pre-industrial simulations (years 101-200).

Model	Period	Historical	GHG	Aerosols	Years	Pre-Industrial
CanESM2	1850-2005	5	5	5	996	1
CCSM4	1850-2005	6	3	6	501	1
CESM1-CAM5	1850-2005	3	3	3	319	1
CSIRO-Mk3.6.0	1850-2005	10	5	5	500	1
FGOALS-g2	1850-2005	5	1	1	700	1
GFDL-CM3	1860-2005	5	3	3	500	1
GFDL-ESM2M	1861-2005	1	1	1	500	1
GISS-E2-H	1850-2005	10	5	10	240	1
GISS-E2-R	1850-2005	16	5	10	300, 401, 401	3
IPSL-CM5A-LR	1850-2005	5	6	1	1000	1
NorESM1-M	1850-2005	3	1	1	501	1

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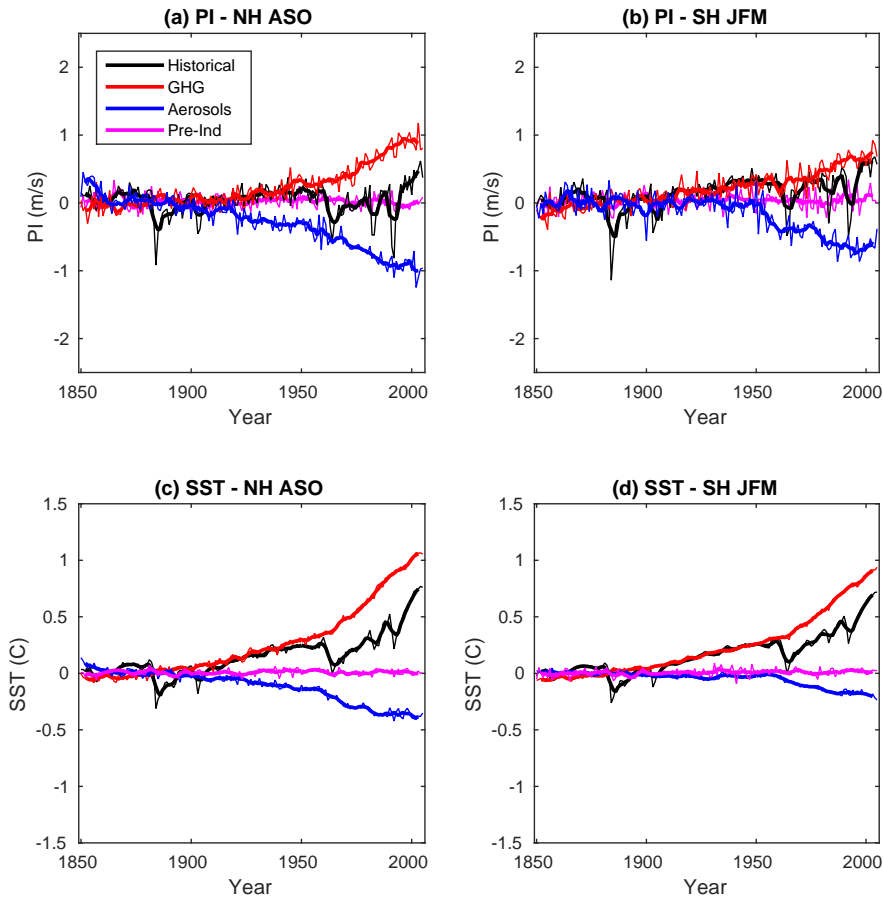
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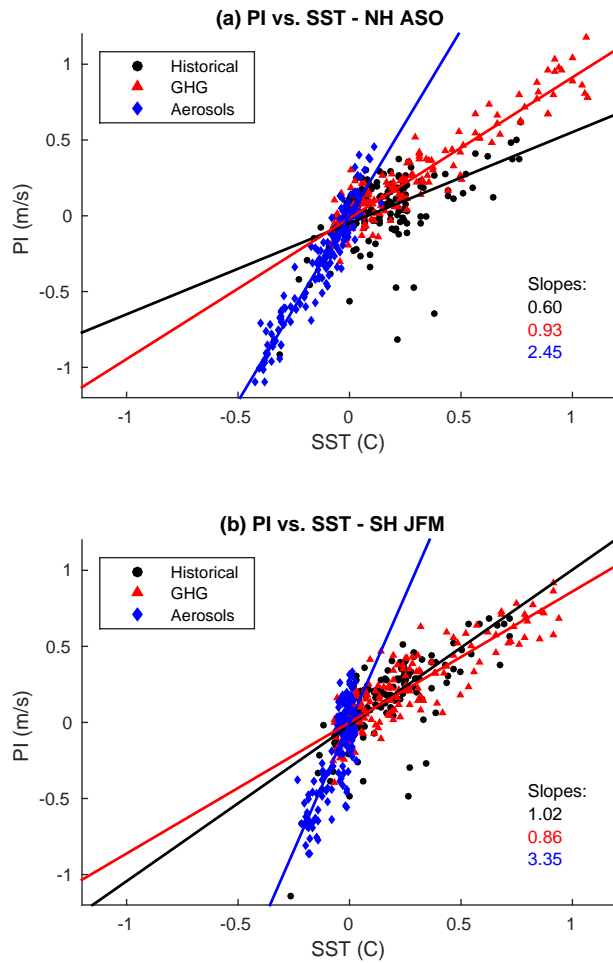
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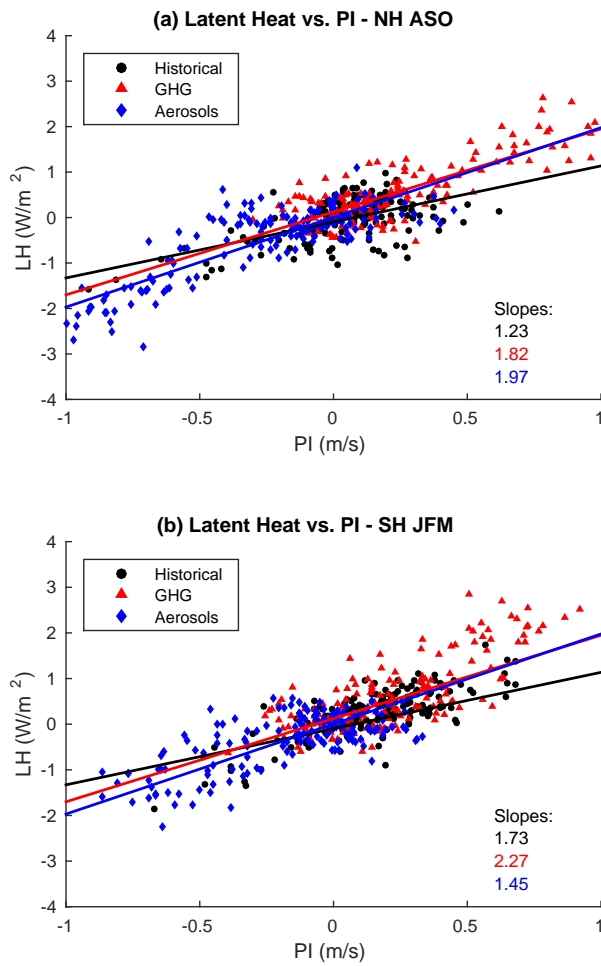
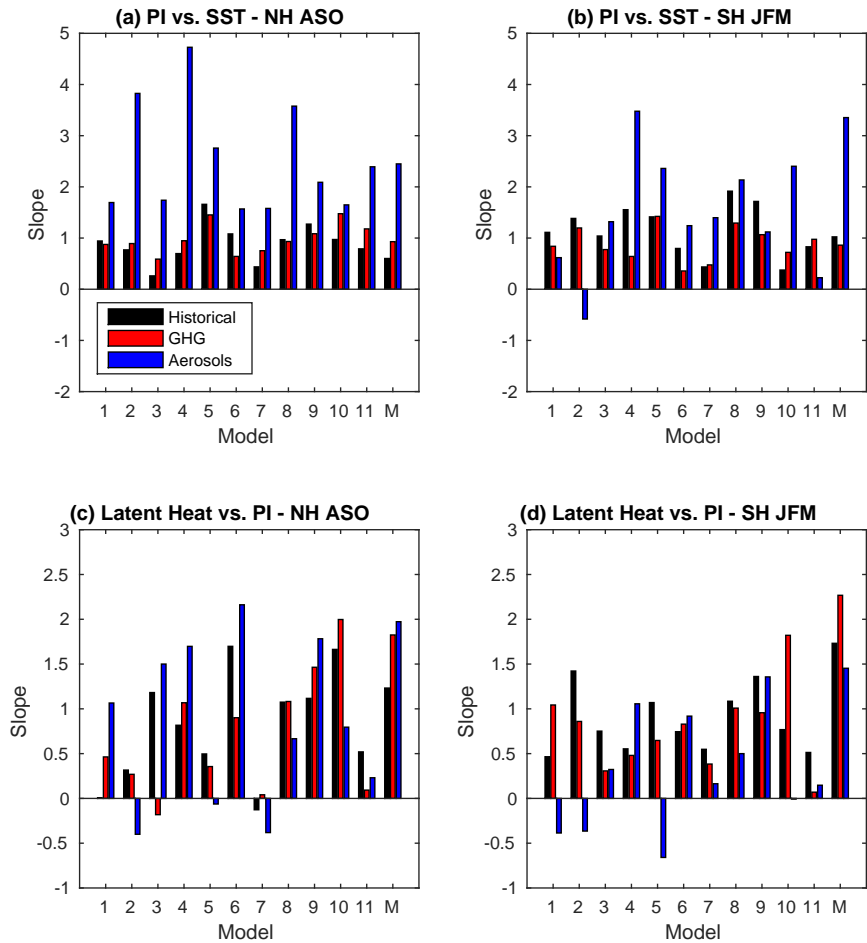
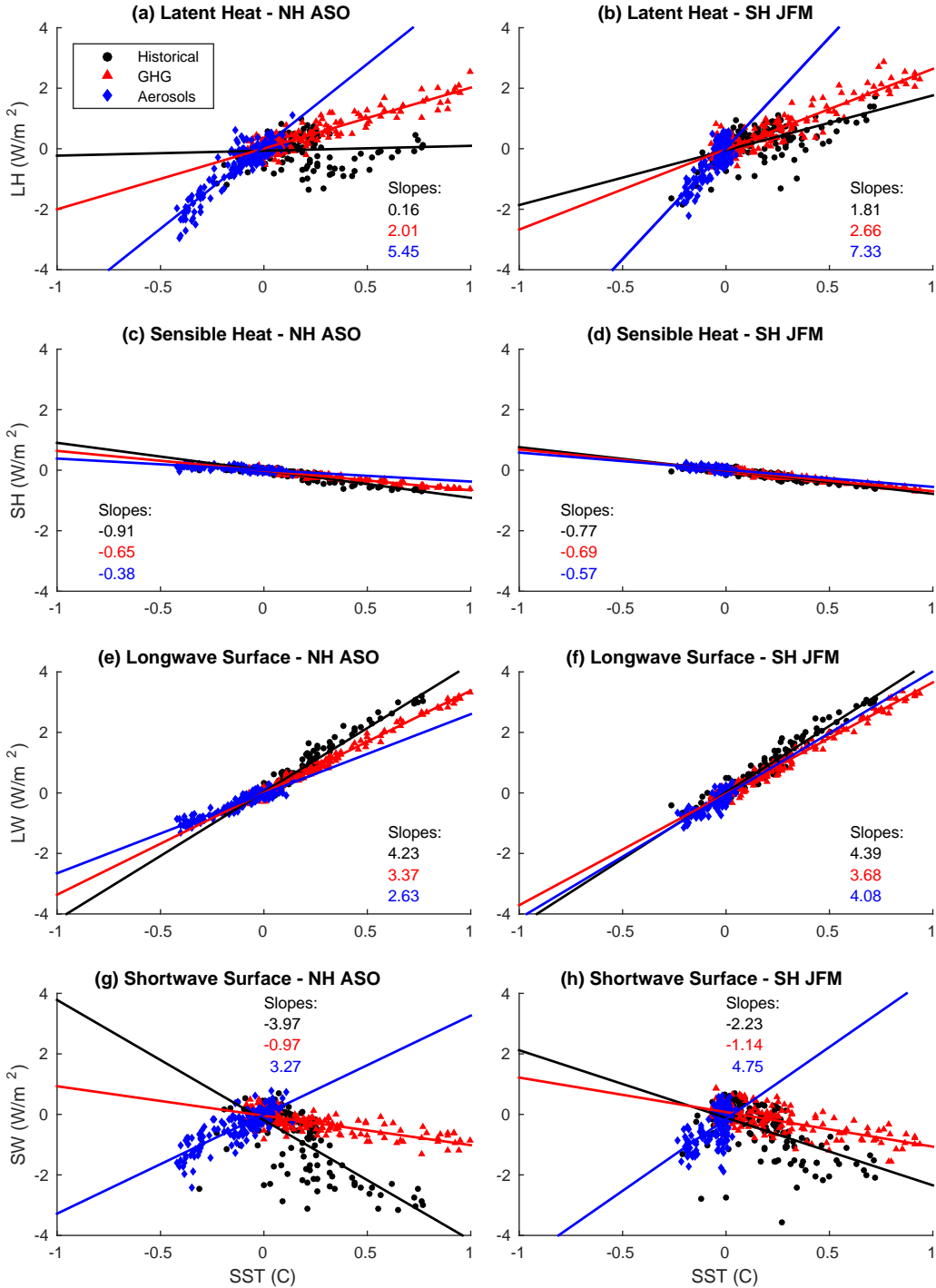


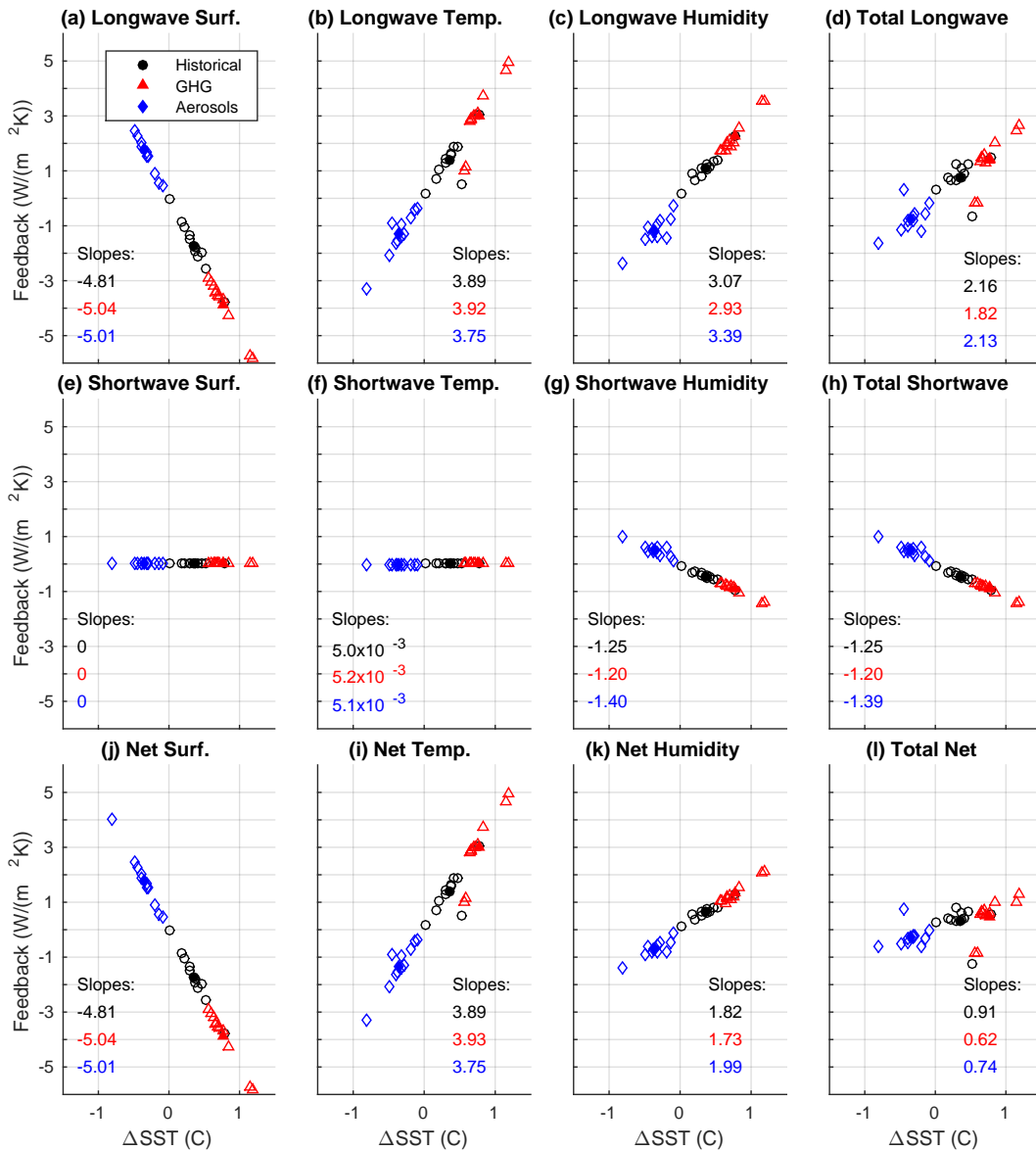
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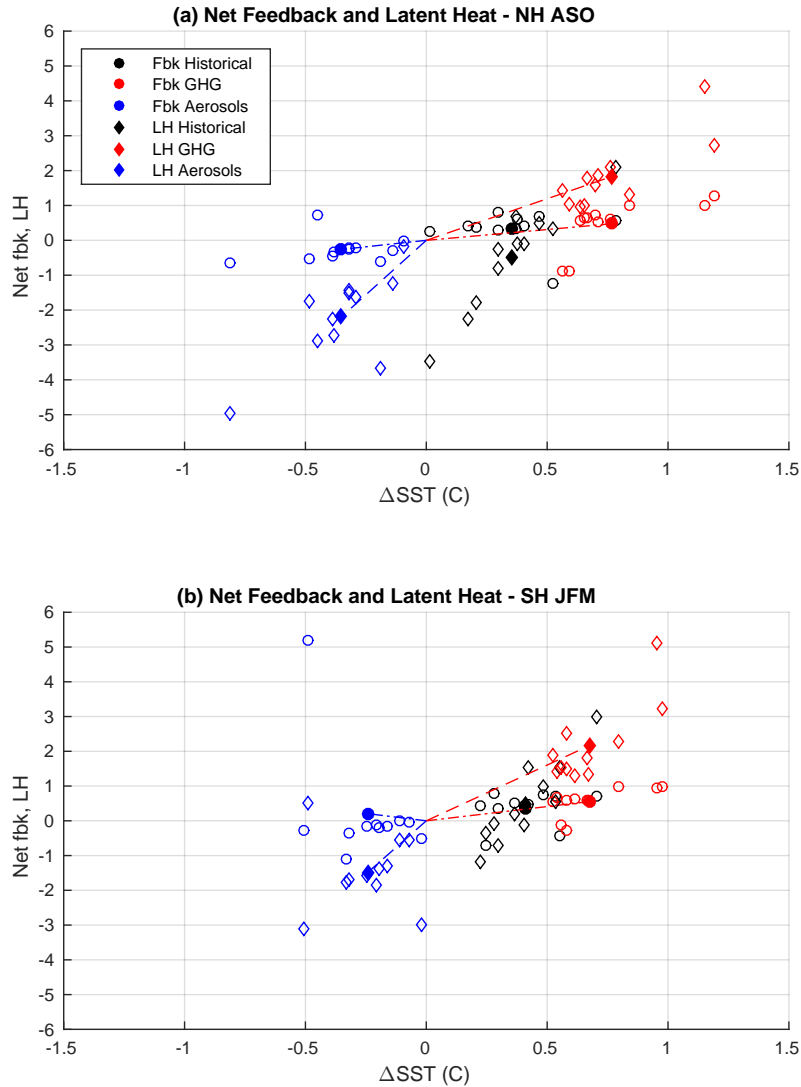
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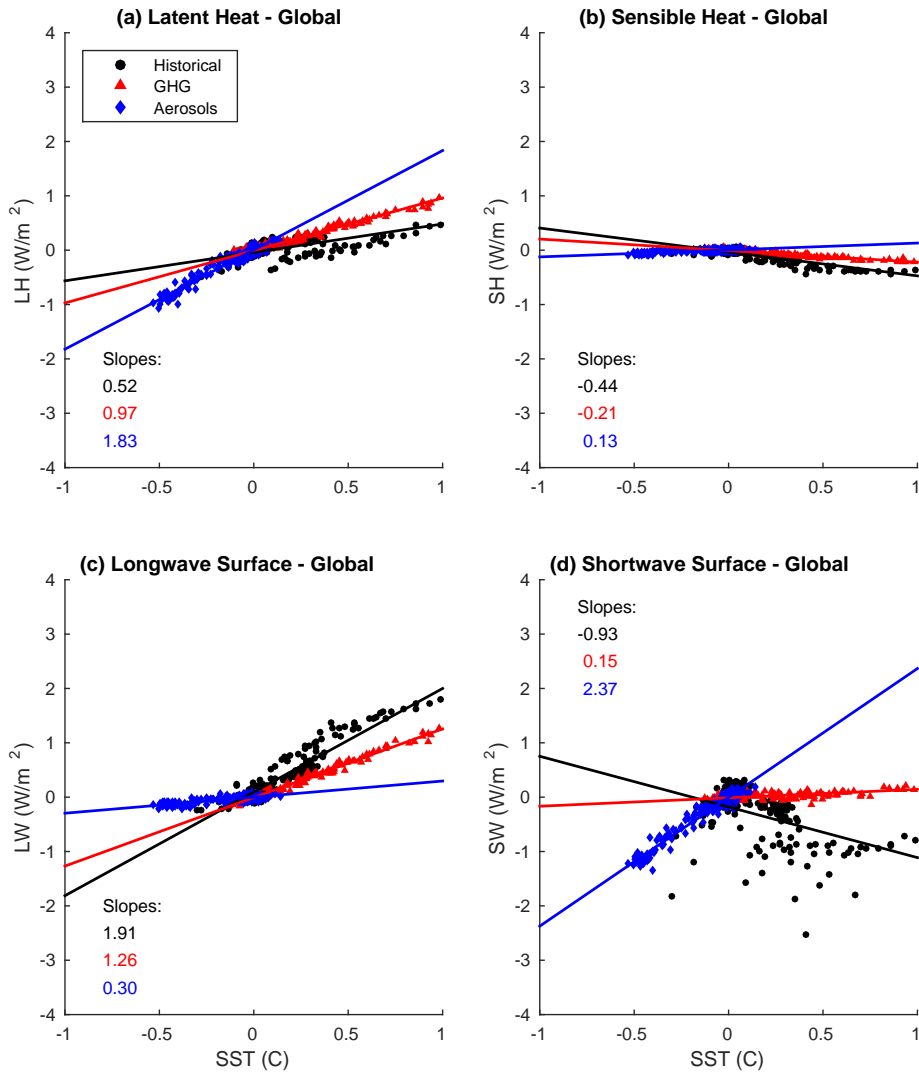


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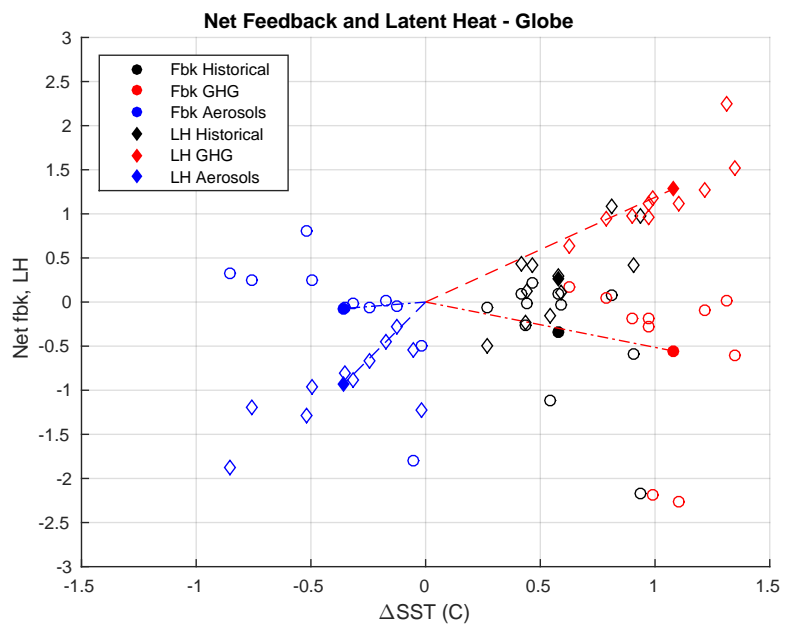
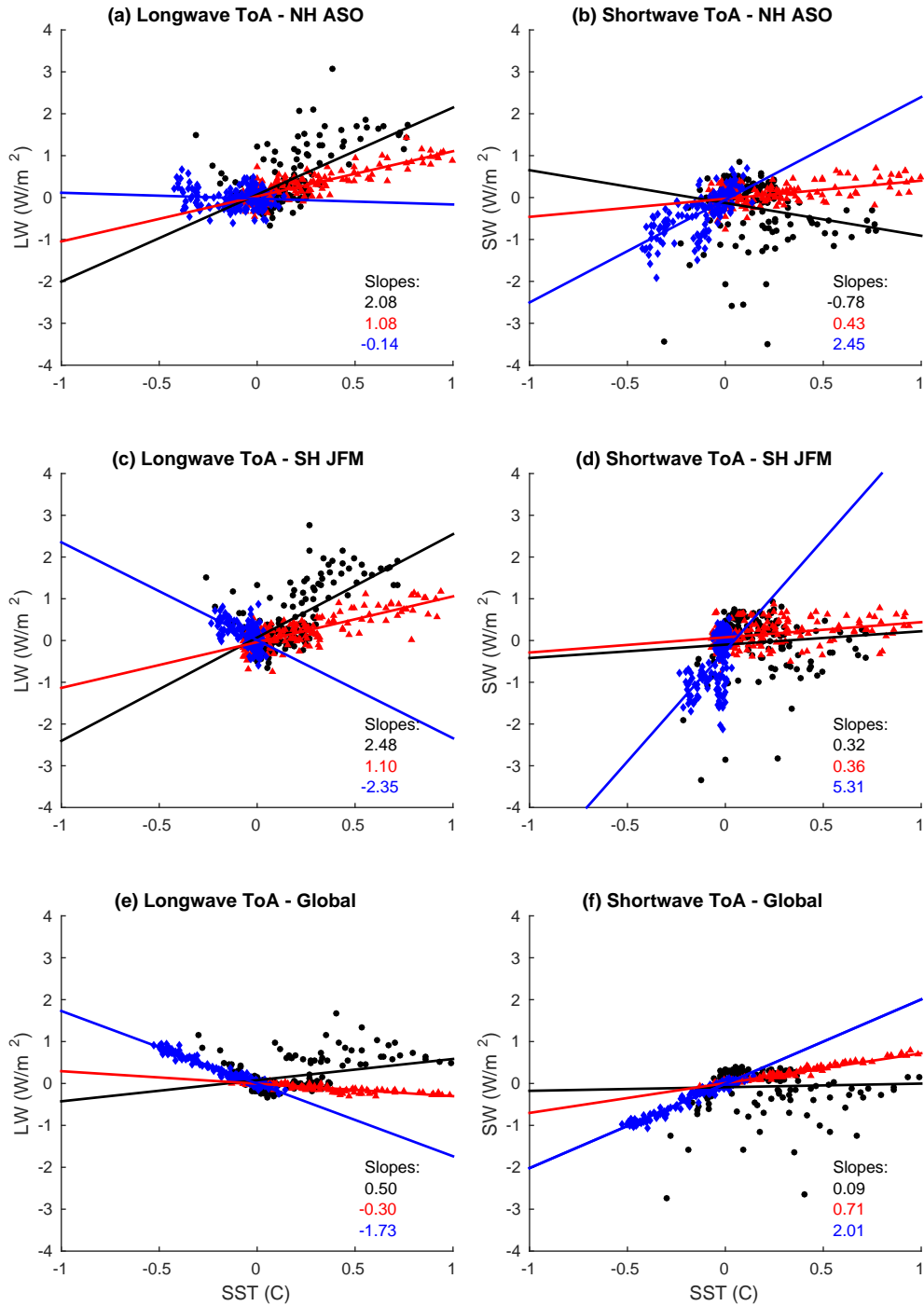


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