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8 **Assessment of paleo-ocean pH records from boron isotope ratio in the Pacific**

9 **and Atlantic ocean corals: Role of anthropogenic CO₂ forcing and**

10 **oceanographic factors to pH variability**

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25 **Abstract**

26 Boron isotopes ($\delta^{11}\text{B}$) records from tropical ocean corals have been used to
27 reconstruct paleo-pH of ocean for the past several decades to few centuries which are
28 comparable to the resolution of instrumental records. In most of the studies, attempts
29 have been made to decipher the role of anthropogenic CO_2 forcing to recent trend of
30 ocean acidification based on $\delta^{11}\text{B}$ derived paleo-pH records. However, such attempts
31 in past were often hindered by limited knowledge of oceanographic factors that
32 contributed to past pH variability and changes. In this study, we have evaluated pH
33 records reconstructed using $\delta^{11}\text{B}$ records from the Pacific and the Atlantic Oceans
34 corals and investigated major forcing factors that contributed to sub annual-decadal
35 scale pH variability and changes since the industrial era ~1850 AD.

36 To the best of our knowledge, total eight $\delta^{11}\text{B}$ records from the Pacific and two
37 from the Atlantic Oceans are available in published literatures. The compilations of
38 these records show large variability; range between 26.27 - 20.82 ‰ which
39 corresponds to pH range 8.40 - 7.63 respectively. Our investigation of pH records from
40 the Pacific ocean based on principal component analysis (PCA) reveals that
41 atmospheric CO_2 can explain maximum up to ~26% of the total pH variability during
42 1950 – 2004 AD, followed by the ocean-climate oscillations (i.e. ENSO and PDO)
43 driven oceanographic factors up to ~17%. The remaining large variability (~57%) could
44 not be explained by above forcing factors and hence we invoke possible influence of
45 metabolic processes of corals and/or changes in micro-environments within the reefs
46 which are often neglected in interpreting paleo-pH records. Therefore, we highlight the
47 need for detailed investigation in future studies to understand about the exact



48 mechanism, processes/factors that controlled boron isotope fractionations in coral reef
49 environments. Further, our investigation reveals that amplitude of the ENSO driven pH
50 variability shows fivefold increase during 1980 – 2000 AD compared to the previous
51 three decades (1950 – 1980 AD). This observation is consistent with the historical
52 records of global coral bleaching events and therefore underscores role of ENSO
53 driven environmental stress responsible for coral bleaching events. Considering model
54 based projections of increasing frequency and amplitude of extreme ENSO events in
55 the backdrop of recent global warming, bleaching events are likely to increase in the
56 next decades/centuries.

57

58 **Key words**

59 Anthropocene; Boron Isotope; Paleo-pH; Ocean acidification

60 **Key points**

- 61 • Coral $\delta^{11}\text{B}$ records show discernable trend since industrial era ~1850 AD with
62 more rapid declining trend since 1970.
- 63 • Atmospheric CO_2 together with ocean-climate oscillations driven oceanographic
64 factors can explain maximum upto 43% of the total pH variability in the Pacific.
- 65 • Atmospheric CO_2 rise contributed to 0.05 unit reduction in pH in the Pacific
66 Ocean during 1950 – 2004 AD.
- 67 • ENSO driven pH variability increased by fivefold during the last three decades.
- 68 • Coral bleaching events are likely to increase more in the next
69 decades/centuries



70 **1 Introduction**

71 Increasing atmospheric CO₂ at unprecedented rate since the industrial revolution, AD
72 ~1850 and its consequences in terms of lowering of ocean pH called “Ocean
73 acidification” has become a growing threat to many calcifying marine organisms
74 (Doney et al., 2009; Hoegh-Guldberg et al., 2007). OA reduces carbonate saturation of
75 seawater (Feely et al., 2004; Hoegh-Guldberg et al., 2007; Langdon and Atkinson,
76 2005; Orr et al., 2005) which has adverse effects on calcifying marine organisms
77 (Langdon and Atkinson, 2005). Atmosphere CO₂ has increased from ca. 280 ppm
78 (Petit et al., 1999) since the beginning of industrial revolution (AD 1850) to ca. 410
79 ppm at present (<https://www.esrl.noaa.gov/gmd/ccgg/trends/>). About 20–30% of the
80 anthropogenic CO₂ has been absorbed by ocean during the last century which
81 resulted decrease in ocean pH by ca. 0.1 unit (Raven et al., 2005; Sabine et al., 2004).
82 Model predictions shows that ocean pH is expected to reduce further by 0.2 to 0.3 unit
83 by end of the 21st century, however, these predictions are associated with large
84 uncertainties (Caldeira and Wickett, 2003; IPCC, 2007; Orr et al., 2001). In order to
85 improve our current understanding about OA process and its future trend, it is
86 important to have knowledge on spatio-temporal evolution of ocean pH. The longest
87 instrumental records of past pH are available only from two stations i.e. Hawaiian
88 Ocean Time Series (HOTS) (Dore et al., 2009) and Bermuda Atlantic Time Series
89 (BATS) (Bates, 2007) stations in the Pacific and the Atlantic oceans respectively.
90 However, these records are available only for the past three decades since AD 1984.
91 Therefore, to have the records of ocean pH beyond the instrumental era, we have to
92 rely on proxy records. Boron isotopes ($\delta^{11}\text{B}$) measured in marine carbonates show



93 promise as a reliable proxy for paleo-ocean pH (Foster and Rae, 2016; Hönisch et al.,
 94 2004; Trotter et al., 2011). Further, boron isotopes of corals provide pH records
 95 comparable to the resolution of instrumental records of the past few decades to
 96 several centuries.

97 Boron has two naturally occurring stable isotopes, ^{10}B and ^{11}B with relative
 98 abundance of 20% and 80% respectively. In seawater column, B behaves as a
 99 conservative element with an average concentration of 4.5 ppm (Lee et al., 2010).
 100 Boron isotope ratio is expressed in the form of delta notation relative to NIST-SRM-
 101 951 (Catanzaro et al., 1970)

$$\delta^{11}\text{B} = \left(\frac{(^{11}\text{B}/^{10}\text{B})_{\text{Sample}}}{(^{11}\text{B}/^{10}\text{B})_{\text{Standard}}} - 1 \right) \times 1000 \quad \text{eq. (1)}$$

102 Dissolved boron in seawater exists in the form of two compounds, boric acid ($\text{B}(\text{OH})_3$)
 103 and borate ion ($\text{B}(\text{OH})_4^-$). The relative abundance of these two compounds critically
 104 depends on ocean pH (Dickson, 1990). The $\delta^{11}\text{B}$ of these compounds varies as a
 105 function of pH, which is recorded in marine carbonates at the time of calcification
 106 (Hemming and Hanson, 1992; Vengosh et al., 1991). When calcifying marine
 107 organisms form their shells, they preferentially incorporate $\text{B}(\text{OH})_4^-$ and hence the $\delta^{11}\text{B}$
 108 of the carbonates is similar to that of the $\text{B}(\text{OH})_4^-$ in ambient seawater (Hemming and
 109 Hanson, 1992). Following is the empirical relation to reconstruct pH of seawater using
 110 $\delta^{11}\text{B}$ measured in marine carbonates, provided that there is no vital effect (species
 111 related variations) (Zeebe and Wolf-Gladrow, 2001)

112 pH

$$113 = pK_B^* - \log \left(- \frac{\delta^{11}B_{SW} - \delta^{11}B_{Borate}}{\delta^{11}B_{SW} - {}^{11-10}K_B \times \delta^{11}B_{Borate} - 1000 ({}^{11-10}K_B - 1)} \right) \quad \text{eq (2)}$$



114 Here, $\delta^{11}\text{B}_{\text{sw}}$ represents delta value of seawater (39.61‰; Foster et al. (2010)), pK_{B}^* is
115 dissociation constant of boric acid (8.597 at 25°C and 35 PSU salinity; Dickson
116 (1990)), $^{11-10}\text{K}_{\text{B}}$ is fractionation factor between $\text{B}(\text{OH})_4^-$ and $\text{B}(\text{OH})_3$ (1.0272; Klochko et
117 al. (2006)) and $\delta^{11}\text{B}_{\text{borate}}$ represents delta value of the sample.

118 Most of the earlier studies have focused on the reconstruction of paleo-pH
119 during the Quaternary glacial-interglacial periods and the Late Cenozoic era using $\delta^{11}\text{B}$
120 records of foraminifera (Hönisch and Hemming, 2005; Martínez-Botí et al., 2015;
121 Pearson and Palmer, 1999; Sanyal et al., 1997; Sanyal et al., 1995). However, similar
122 studies on shorter time scale (annual-decadal scale) based on coral records
123 particularly in the time scale of the Anthropocene are sparse. Boron isotopes have
124 been studied in corals from the Pacific and the Atlantic oceans (D'Olivo et al., 2015;
125 Fowell et al., 2018; Goodkin et al., 2015; Kubota et al., 2017; Liu et al., 2014; Pelejero
126 et al., 2005; Shinjo et al., 2013; Wei et al., 2009; Wei et al., 2015; Wu et al., 2018) to
127 reconstruct pH records of the past few decades to several centuries. In most of these
128 studies, it has been suggested that pH variability is mostly controlled by various
129 oceanographic factors such as upwelling, ocean circulation, river run-off and
130 productivity and therefore, making difficult to deconvolute the contribution of
131 anthropogenic pCO_2 forcing in modulating ocean pH. Further, several oceanographic
132 factors and their contributions are highly variable in space and time. In order to
133 improve our current understanding about recent trend of OA caused by anthropogenic
134 CO_2 during the past two centuries, it is important to have the knowledge on past pH
135 variability driven by oceanographic factors and their contributions.



136 In this study, we have made a comprehensive assessment of pH records
137 reconstructed using $\delta^{11}\text{B}$ of corals from the Pacific and the Atlantic oceans and
138 investigated forcing factors and their contributions to pH variability.

139 **2. pH records from the Pacific and the Atlantic Ocean corals**

140 We have compiled boron isotope ($\delta^{11}\text{B}$) derived pH records from the Pacific and
141 Atlantic oceans. In addition, we have also adopted a new approach to reconstruct pH
142 record based on theoretical calculation of the past records of carbonate system
143 parameters (pCO_2 , total alkalinity (TA), sea surface temperature (SST) and salinity
144 (SSS)) from the same corals and using them into the CO2SYS program. In the
145 following sections, we have discussed about the pH records reconstructed using two
146 independent methods.

147 **2.1 $\delta^{11}\text{B}$ derived pH records**

148 We have compiled all the $\delta^{11}\text{B}$ records of corals from the Pacific and the Atlantic
149 oceans. To the best of our knowledge, total ten records with resolution of 1 – 5 years
150 are available in literature; however, no such record exists for the Indian Ocean (Fig. 1;
151 Table 1). For these records, boron isotope measurements in corals were performed
152 either by TIMS or MC-ICPMS instruments with analytical uncertainty better than \pm
153 0.34‰ ($\pm 2\sigma$ SD) which corresponds to the pH uncertainty of ~ 0.05 . For all the records
154 compiled in this study, pH of the calcifying fluid (pH_{CF}) was calculated using equation
155 2. The values of $\delta^{11}\text{B}_{\text{sw}}$ (39.6‰; Foster et al. (2010)) and dissociation constants pK_{B}^*



156 (8.597 at 25°C and 35 PSU salinity; Dickson (1990)), $^{11-10}\text{K}_\text{B}$ (1.0272; Klochko et al.
157 (2006)) are used in equation 2. In order to compare these records, pH of the seawater
158 (pH_SW , total scale) for all the records was calculated using the calibration equation for
159 the coral species, *Porites cylindrica*, $\text{pH}_\text{SW} = (\text{pH}_\text{CF} - 4.72)/0.466$ (Fowell et al., 2018;
160 Liu et al., 2014; McCulloch et al., 2012; Trotter et al., 2011) (see the supplementary
161 data). The compilation of ten $\delta^{11}\text{B}$ records from the Pacific and the Atlantic Oceans
162 shows large variability; range between 26.27 - 20.82 ‰ which corresponds to pH_SW
163 range 8.40 - 7.63 (Figs. 2, 3 & Table 1). A LOESS fit (non-parametric fit) of these $\delta^{11}\text{B}$
164 records which is independent of data density show discernible decreasing trend since
165 the beginning of industrial era ~1850 AD, however, rapid declining trend was observed
166 since ~1970 AD (Fig. 2). Since $\delta^{11}\text{B}$ is linearly related to pH, decrease in $\delta^{11}\text{B}$ (Fig. 2)
167 corresponds to decrease in ocean pH.

168 In order to understand past ocean pH variability on a regional scale, $\delta^{11}\text{B}$
169 derived pH are grouped into four oceanic sectors (Fig. 1 & 3) based on the proximity of
170 these coral records i.e. Great Barrier Reef (GBR), South China Sea (SCS), North-
171 West Pacific and North-West Atlantic (Fig. 1 & 3). Four $\delta^{11}\text{B}$ derived pH records are
172 available from the South-West Pacific (GBR) (Fig. 3a) i.e. two are from the GBR
173 (D'Olivo et al., 2015; Wei et al., 2009) and another two from the Flinders reef (Pelejero
174 et al., 2005) and New Caledonia reef (Wu et al., 2018). The $\delta^{11}\text{B}$ records from the
175 GBR vary from 26.27 to 21.06 ‰ and its corresponding pH ranges from 8.40 to 7.67
176 (Fig. 3a). The $\delta^{11}\text{B}$ records from the SCS (Fig. 3b) vary from 26.00 to 20.82 ‰ and
177 corresponding pH ranges from 8.37 to 7.63 (Liu et al., 2014; Wei et al., 2015). The
178 records of $\delta^{11}\text{B}$ from the north-west Pacific varies from 25.02 to 22.10 ‰ and its



179 corresponding pH ranges from 8.23 to 7.82 (Fig. 3c) (Kubota et al., 2017; Shinjo et al.,
180 2013). To the best of our knowledge, only two pH records are available from the
181 Sargasso Sea and the Mesoamerican Barrier Reef System (MBRS) in the Atlantic
182 Ocean (Fowell et al., 2018; Goodkin et al., 2015) of which $\delta^{11}\text{B}$ ranges from 25.36 to
183 22.70 ‰ and its corresponding pH ranges from 8.28 to 7.91 (Fig. 3d).

184

185 **2.2 Reconstruction of pH records using carbonate system parameters in** 186 **CO2SYS program**

187 We have adopted a novel approach to reconstruct paleo-pH of ocean based on the
188 past records of carbonate system parameters (hereafter, theoretical pH). Carbonate
189 system comprises of six parameters (pH, CO_2 , $[\text{CO}_3^{2-}]$, $[\text{HCO}_3^-]$, TA and DIC) (Dickson
190 et al., 2007; Millero, 2006; Zeebe and Wolf-Gladrow, 2001). At any given two known
191 carbonate system parameters along with SST and SSS, we can theoretically calculate
192 other parameters. We have reconstructed theoretical pH using Matlab based CO2SYS
193 program (Van Heuven et al., 2011). For theoretical pH reconstruction, we have used
194 past records of SST, SSS, TA and pCO_2 . Past SST and SSS were reconstructed
195 based on proxy records of Sr/Ca, Mg/Ca and $\delta^{18}\text{O}$ from the same corals in which $\delta^{11}\text{B}$
196 records are available. The details of the past SST, SSS and TA reconstructions are
197 provided in supplementary material (section S1 & Table S1). Such coral records are
198 available only from three sites i.e. GBR (Wei et al., 2009), SCS (Wei et al., 2015) and
199 Sargasso Sea (Goodkin et al., 2015). The reconstructed theoretical pH ranges from
200 8.05 - 8.16 in the GBR, 8.16 - 8.04 in the SCS and 8.19 - 8.09 in the Sargasso Sea.
201 Since the reconstructed parameters (SST, SSS and TA) are associated with



202 uncertainties, hence we did error propagation and estimated net uncertainty
203 associated with the theoretical pH (gray shade, Fig. 3) using Monte-Carlo error
204 propagation method in MATLAB (Wagener et al., 2001) (see supplementary material,
205 Section S2). We also performed sensitivity analysis of the parameters i.e. temperature,
206 salinity, pCO₂ and total alkalinity to the error associated with the pH reconstruction
207 using CO2SYS program (See supplementary material, Fig.S2).

208 Theoretical pH records show monotonic decreasing trend since ~ 1850 AD
209 which is consistent with that of atmospheric CO₂ forcing since the beginning of the
210 industrial era (Fig. 3). Variability in $\delta^{11}\text{B}$ derived pH records is larger than theoretical
211 pH in case of Pacific Ocean, whereas in case of Atlantic they mostly fall within the
212 error envelopes (Fig. 3). This clearly indicates that contribution of atmospheric CO₂ and
213 physical parameters (SST and SSS) to the total pH variability are much lower
214 compared to other factors in the coral reef environments which are highly variable from
215 one reef to another in the Pacific. However, it is noteworthy to mention that in spite of
216 lower contribution of atmospheric CO₂ to pH, it shows discernable decreasing trend in
217 most of the records since ~1850 AD. We have compared theoretical pH and $\delta^{11}\text{B}$
218 derived pH records with model derived pH projections (Hartin et al., 2016) for the lower
219 latitude (<55° Latitude) for various representative concentration pathway (RCP)
220 scenarios. This shows that the theoretical pH records overall follow the historic record;
221 decrease in the ocean pH will be more severe in coming decades/century (Fig. 3e). It
222 is important to mention here that neither such proxy records nor long-term instrumental
223 records of ocean pH are available from the Indian Ocean.

224



225 3. Discussion

226 Ocean pH is influenced by multiple factors such as temperature (Dissard et al., 2012;
227 Reynaud et al., 2004), upwelling (Wei et al., 2015), ocean circulation (Pelejero et al.,
228 2005; Wei et al., 2009), precipitation (Deng et al., 2013; Liu et al., 2014), run off
229 (D'Olivo et al., 2015), nutrients supply and productivity (Bates et al., 2010; Goodkin et
230 al., 2015). Therefore, the knowledge on spatio-temporal evolution of ocean pH and its
231 link to ocean-climate oscillations are important for recognizing individual factors and
232 their relative contribution. To identify the regions that come under the influence of
233 known ocean-climate oscillations, spatial correlation of temperature and precipitation
234 were performed with the indices of dominant climate oscillations ((El-Niño southern
235 oscillation (ENSO) and Pacific decadal oscillation (PDO)) using online software
236 “climate analyzer” (http://cci-reanalyzer.org/reanalysis/monthly_correl/). The regions of
237 significant (90% significance level) correlations are highlighted in color bands (Fig. 4(I)
238 a, b, c & d). Similarly, spatial correlation analysis was performed with Atlantic multi-
239 decadal oscillation (AMO) and North Atlantic Oscillation (NAO) which are known as
240 dominant oscillations in the Atlantic (Fig. 4(II) a, b, c & d). Overall, we observe that all
241 the coral sites in this study come under the influence of ENSO and PDO in the Pacific
242 and AMO and NAO in the Atlantic though the modulation of SST, precipitations, run-off
243 and oceanographic parameters nutrient supply, upwelling and circulations and
244 therefore responsible for changes in ocean pH.

245 As $\delta^{11}\text{B}$ variability is the direct response of ocean pH and therefore,
246 periodicities determined based on power spectrum analysis of $\delta^{11}\text{B}$ records enable us
247 to establish linkages between the pH variability and the specific oscillations i.e. ENSO



248 and PDO in the Pacific and AMO and NAO in the Atlantic. Further, wavelet analyses of
249 these records decompose the $\delta^{11}\text{B}$ time series into time and frequency space and
250 highlights in color bands (Fig. 4(I) & 4(II)). All the periodicities observed in $\delta^{11}\text{B}$ records
251 and ocean-climate indices are listed in table 2 including the climate indices
252 (supplementary Fig. S3). In the following sections we have discussed about the
253 specific oscillation that registered in the $\delta^{11}\text{B}$ records and how they evolved in the past.

254 **3.1 $\delta^{11}\text{B}$ variability in the Pacific and Atlantic oceans and their link to ocean-** 255 **climate oscillations**

256 The $\delta^{11}\text{B}$ records from the South China Sea (SCS) (Wei et al., 2015) and the Guam
257 Island in north-west Pacific (Shinjo et al., 2013) show dominant periodicities of ~3, ~6
258 and ~17 years (Fig. 4(I) e, f; Table 2). Though these two coral reefs represent different
259 oceanic environments (SCS represents coastal environment and the Guam Island
260 represents open ocean environment), they exhibit common periodicities of ~3 years
261 and ~6 years (Fig. 4(I) e, f). However, another record (1825 – 2000 AD) from the
262 proximity (Liu et al., 2014) in coastal region of SCS (Fig. 3b) does not show any
263 significant periodicity. This could be due to lower resolution (4 years) of this record and
264 hence, the high frequency oscillations do not get captured in the power spectrum
265 analysis. Two records from the central GBR in the South Pacific (D'Olivo et al., 2015;
266 Wei et al., 2009) have shown dominant periodicities of ~3, ~5, ~10 and ~23 years (Fig.
267 4(I) g & h; Table 2). Flinders reef in the south-western Pacific (Pelejero et al., 2005),
268 shows dominant periodicities of ~10, ~16 and ~50 years (Fig. 4(I) i). New Caledonia is
269 one of the longest records with annual resolution exhibits periodicities of ~5.4, ~7, ~13



270 and ~30 years (Fig. 4(I) j). Most of the frequencies captured in the analysis fall within
271 the band of ENSO (2 – 8 years) and few of them are within the band of PDO (decadal
272 scale) respectively (Table 2). ENSO has strong influence on upwelling in the Pacific
273 (Inoue et al., 2001; Ishii et al., 2009; Sutton et al., 2014; Takahashi et al., 2003) and
274 nutrient supply to the coastal regions of the SCS through rivers run-off. The PDO,
275 another dominant ocean-climate mode is known to influence physical and
276 biogeochemical conditions and thereby influence ocean pH at decadal time scale
277 (D'Olivo et al., 2015; Pelejero et al., 2005; Wei et al., 2009; Wu et al., 2018).

278 The $\delta^{11}\text{B}$ record from the Sargasso Sea (Goodkin et al., 2015) shows dominant
279 periodicities of ~5, ~7, and ~14 years (Fig. 4(II) e; Table 2). Further wavelet analysis
280 shows dominant periodicities at 4 - 8 year band throughout the last two centuries and
281 14 - 20 year band during AD 1870 - 1970. The $\delta^{11}\text{B}$ record from the MBRS shows
282 periodicities of ~7, ~17 and ~25 years (Fig. 4(II) f, g). The lower periodicities less than
283 10 years are similar to that of NAO and therefore highlight the role of NAO in
284 modulating ocean pH at annual-decadal scale (Supplementary Fig. S3). The longer
285 periodicities at decadal scale (~10 years and 25 years) captured in the spectrum
286 analysis are similar to that of AMO and hence indicates its role in modulating ocean
287 pH (Supplementary Fig. S3).

288 In conclusion, our analysis clearly indicates that ocean pH is influenced by
289 oceanographic factors modulated by dominant ocean-climate modes i.e. ENSO and
290 PDO in the Pacific and NAO and AMO in the Atlantic oceans.



291 **3. Identification of forcing factors and their contribution to pH variability**

292 Atmospheric CO₂ and oceanographic factors driven by ocean-climate oscillations are
293 known to influence ocean pH, however, their relative contribution are not well
294 constrained. Therefore, it is indeed important to identify dominant factors and quantify
295 their relative role in controlling pH variability in the Pacific and the Atlantic oceans. For
296 this purpose, we have employed statistical method “Principal Component Analysis
297 (PCA)” to all the available $\delta^{11}\text{B}$ records using excel based XLSTAT[®] program
298 (<https://www.xlstat.com>). For this analysis, at least four records are required for better
299 statistical control and therefore, we restricted this analysis up to the Pacific records
300 within the time slice 1950 – 2004 AD in which the highest numbers of records (Fig. 5a)
301 are available (Fig. 2). PCA is a statistical method which reduces multi-dimensional
302 complex dataset consisting of large number of inter-related variables into few simpler
303 variables without significant loss of original information (Abdi and Williams, 2010;
304 Meglen, 1992). Further, PCA also recognizes pattern and explain large dataset with
305 interrelated variables. The results obtained from the PCA analysis is shown in Fig. 5a,
306 b & c. The first (PC1) and second principal components (PC2) explain 26.2% and
307 16.7% of the total variability respectively (Fig. 5a).

308 The overall trend of the PC1 is consistent with the increasing trend of
309 atmospheric CO₂; (Fig. 5b). Hence, we recognize PC1 as a factor that representing
310 atmospheric CO₂ forcing. In earlier studies, it has been reported that atmospheric CO₂
311 forcing contributes less than 10% of the total pH variability in the Atlantic (Goodkin et
312 al., 2015), which is lower than the estimate (~26%) in the Pacific Ocean. Power
313 spectrum analysis of the PC2 shows significant periodicities of ~20 and ~4.5 years



314 which are similar to that of PDO and ENSO respectively and therefore we recognize
315 PC2 as an oceanographic factor. In conclusion, our investigation reveals that
316 atmospheric CO₂ forcing together with oceanographic factors (ENSO and PDO driven
317 changes) can explain maximum up to 43% of the total pH variability in the Pacific. It is
318 noteworthy to highlight here that remaining variability of 57% could not be explained by
319 the forcing factors mentioned above. Hence, we invoke metabolic processes of corals
320 and changes in micro-environment within the corals reefs might play an important role
321 on boron isotope fractionation, and therefore, highlights the need for further
322 investigation. Few laboratory experiments and field studies have suggested that micro-
323 environment in corals reefs and metabolic processes play an important role in
324 regulating pH of the calcifying fluid (CF) (McCulloch et al., 2012; Wall et al., 2016).
325 Corals elevate pH of the CF region to facilitate calcification, called pH-upregulation (Al-
326 Horani et al., 2003; Gattuso et al., 1999; McConnaughey and Whelan, 1997;
327 McCulloch et al., 2012; Wall et al., 2016) and hence record the pH of the CF region
328 rather than the ambient seawater (Allison et al., 2010; Anagnostou et al., 2012;
329 McCulloch et al., 2017). Therefore, the species specific pH-upregulation is one of the
330 important caveats that need to be considered while reconstructing ocean pH using
331 $\delta^{11}\text{B}$ records. To circumvent this problem, species specific calibration is indeed
332 important for pH reconstruction using $\delta^{11}\text{B}$ records (McCulloch et al., 2012; Trotter et
333 al., 2011).

334 We compared PC1 with the instrumental record of annual mean ocean pH from
335 the HOTS time series station in the Pacific which is available since 1988. Overall, they
336 follow similar trend (Fig. 6a), however, scatter plot shows two distinct trends



337 compatible with linear fits (Fig. 6b). This indicates two dominant processes that control
338 pH variability at HOTS station. We have reconstructed two pH records corresponding
339 to the PC1 using these regressions equations. The PC1 derived pH record (blue
340 curve) follow closely with the trend of theoretical pH curve whereas other (red-curve)
341 shows large off-set. Therefore, the PC1 derived blue curve corresponds to the pH
342 curve due to changes in atmospheric CO₂.

343 PC2 is a factor that represents the Pacific oscillations i.e. ENSO and PDO as
344 discussed above. It is important to understand how ENSO and PDO individually
345 contributed to the pH variability. To infer about how these two modes individually
346 influenced pH variability in the Pacific Ocean, we have deconvolute the signals of
347 ENSO and PDO from the PC2 time series by filtering them at 4-5 years and 18-20
348 years bands respectively (Fig. 7b, & c). It is noteworthy to observe that PC2 at ENSO
349 band shows higher amplitude variability after ~1970 AD whereas at PDO band does
350 not show any discernable changes. To quantify ENSO driven pH variability, we have
351 estimated scaled average variance which shows almost fivefold increase during 1980
352 – 2004 compared to that of previous decades 1950 – 1980 (Fig. 7b). Since many of
353 the historical coral bleaching events are often associated with extreme El-Niño events
354 (Hoegh-Guldberg, 1999; Hughes et al., 2018; Kelmo et al., 2014), we have compared
355 ENSO signal with the reported global coral bleaching events (Hughes et al., 2018) .
356 The trend of the coral bleaching events follows almost similar to the trend of the
357 variance of ENSO signal (Fig.7 b & d). This indicates that large pH variability and
358 some of extensive corals bleaching events are associated with extreme ENSO events.
359 Modeling studies suggested that in the backdrop of the increasing greenhouse



360 warming, frequencies and amplitude of ENSO and associated extreme events are
361 expected to increase in the next decades (Cai et al., 2014; Cai et al., 2012), therefore,
362 frequency of coral bleaching events and its magnitude particularly in the Pacific Ocean
363 are also expected to increase in future decades/centuries (Ainsworth et al., 2016;
364 Kwiatkowski et al., 2015).

365 4. Conclusions

366 In this study, we have assessed published high resolution records of $\delta^{11}\text{B}$
367 derived pH from the Pacific and the Atlantic Ocean corals to decipher the contribution
368 of atmospheric CO_2 forcing vis-à-vis oceanographic factors to pH variability and
369 changes during the past two centuries. This study based on the large data sets
370 provide a holistic picture of the pH variability and relative role of individual forcing
371 factors in the Pacific and the Atlantic oceans. Our specific observations and findings
372 are concluded below

- 373 i. Compilation of $\delta^{11}\text{B}$ records shows overall decreasing trend during the past two
374 centuries with more rapid decrease since ~1970 AD. This observation is
375 consistent with the concomitant rise of atmospheric CO_2 since the industrial
376 revolution ~1850 AD.
- 377 ii. pH variability in the Pacific ocean is larger than that of the Atlantic ocean which
378 suggests dominant role of ENSO and PDO in modulating ocean pH.
- 379 iii. Our investigations based on principal component analysis of the $\delta^{11}\text{B}$ derived
380 pH records reveals ~26% and ~17% variability in the Pacific ocean pH are
381 explained by atmospheric CO_2 and Pacific ocean-climate oscillations



382 respectively. Remaining large unexplained variability (57%) might be related to
383 metabolic processes and micro-environmental changes of the corals reefs.
384 Therefore, we highlight the need for more detailed investigation of boron
385 isotope fractions and its relations to specific metabolic processes and micro-
386 environmental changes based on laboratory experiments and field studies in
387 the corals reefs.

388 iv. We have estimated pH reduction in the Pacific Ocean by 0.5 unit due to
389 anthropogenic CO₂ forcing; rise of atmospheric CO₂ from 310 to 380 ppm
390 during 1950 – 2004.

391 v. ENSO driven pH variability shows large increase during 1980 – 2004 compared
392 to previous decades (1950 – 1980). This observation is consistent with the
393 reported global coral bleaching events. This indicates thermal stress associated
394 with extreme ENSO events could be responsible for coral bleaching events.

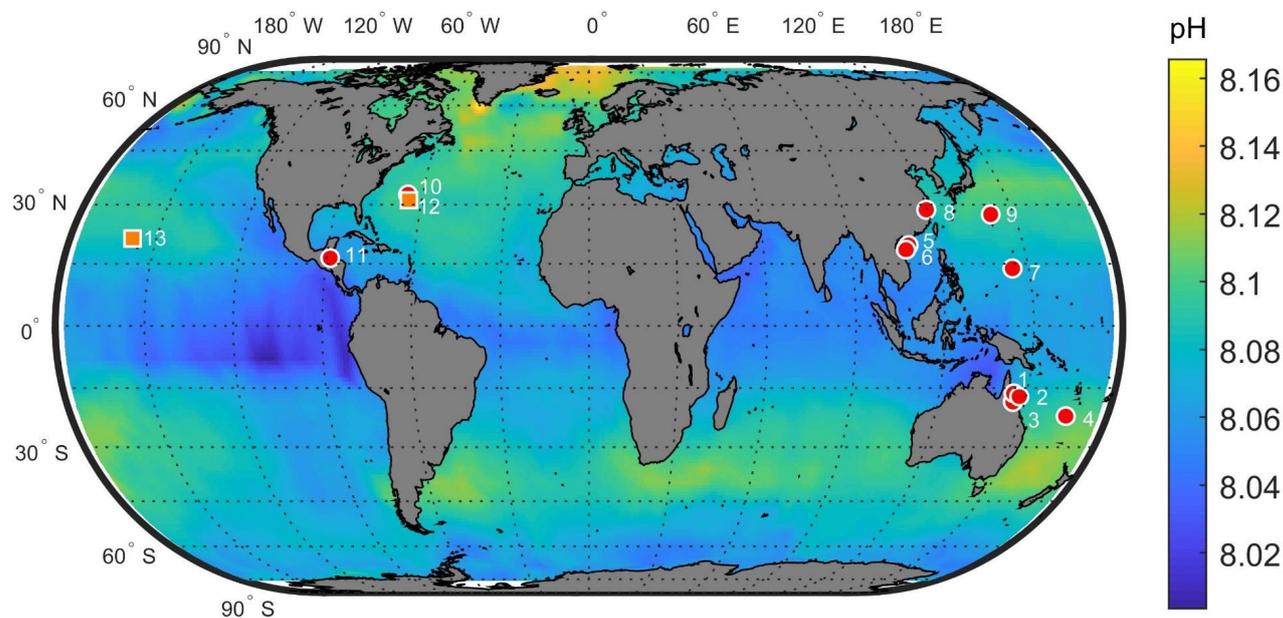
395 vi. Considering the model based prediction of the extreme events associated with
396 ENSO in the backdrop of the increasing global warming, coral bleaching events
397 are likely to increase in future decades/centuries.

398

399 **Acknowledgement**

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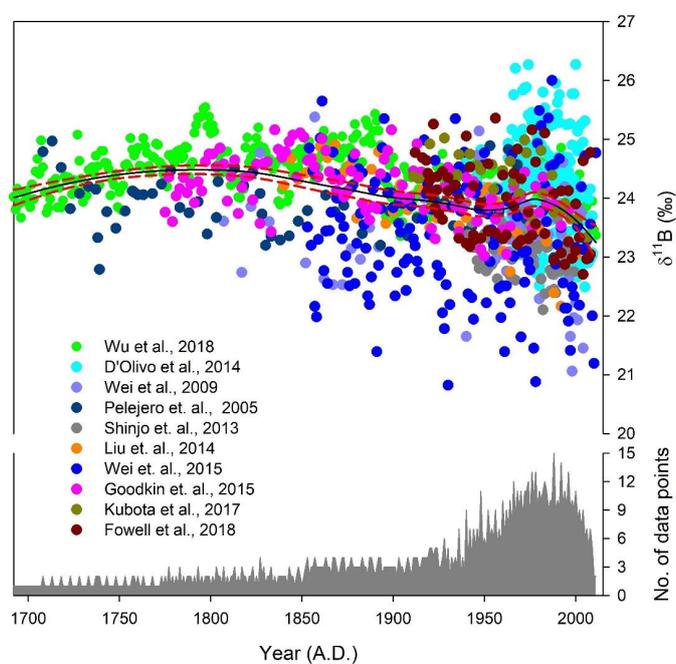


1. Wei et al., 2009 2. Pelejero et al., 2005 3. D'Olivo et al., 2015 4. Wu et al., 2018 5. Wei et al., 2015 6. Liu et al., 2014
7. Shinjo et al., 2013 8 & 9. Kubota et al., 2017 10. Goodkin et al., 2015 11. Fowell et al., 2018 12. BATS 13. HOTS

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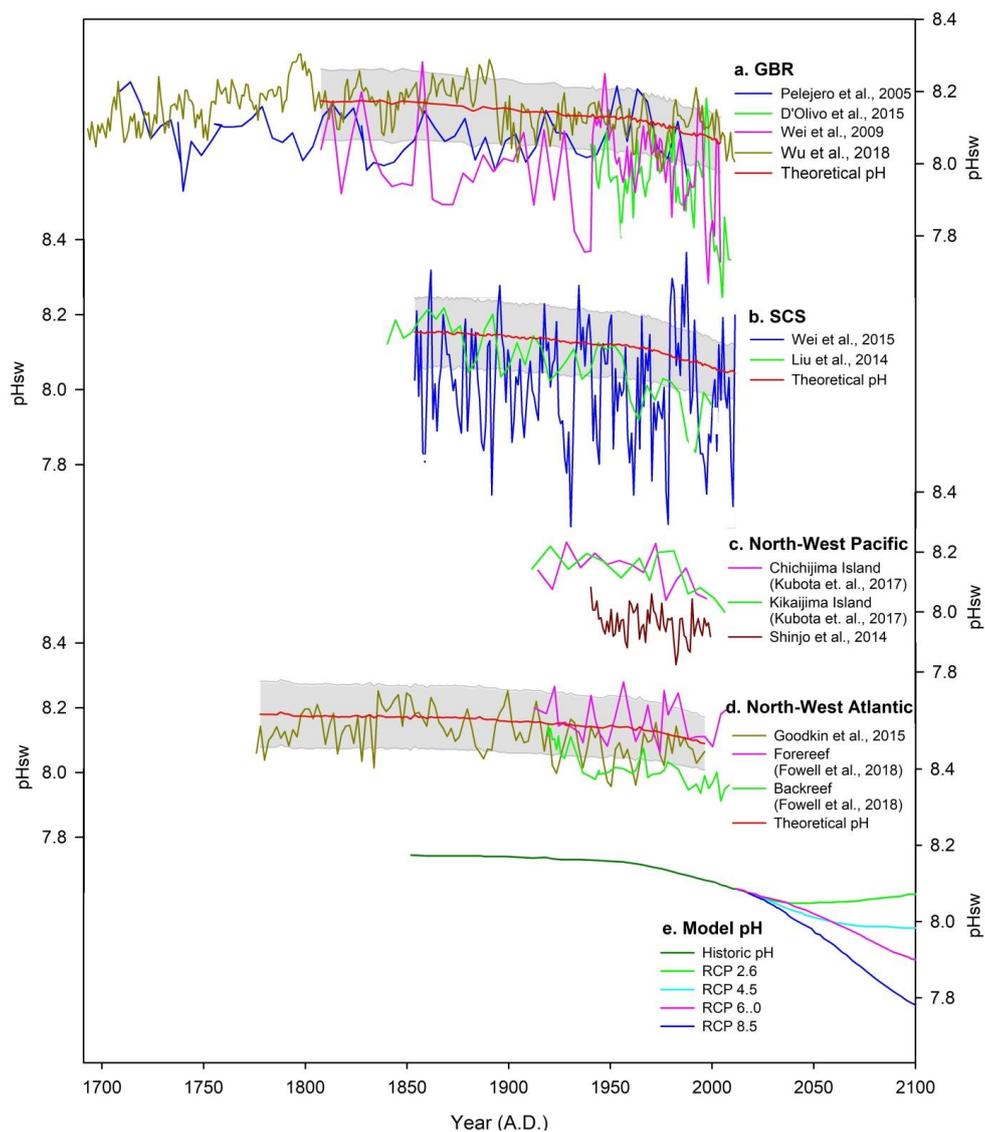
405 Figure 1: Location of the coral reefs from where $\delta^{11}\text{B}$ records are available (shown in red circle). Square show in-situ pH time series stations i.e.

406 HOTS in the Pacific and BATS in the Atlantic. Color band represent pH of the surface ocean from Takahashi et al. (2014).



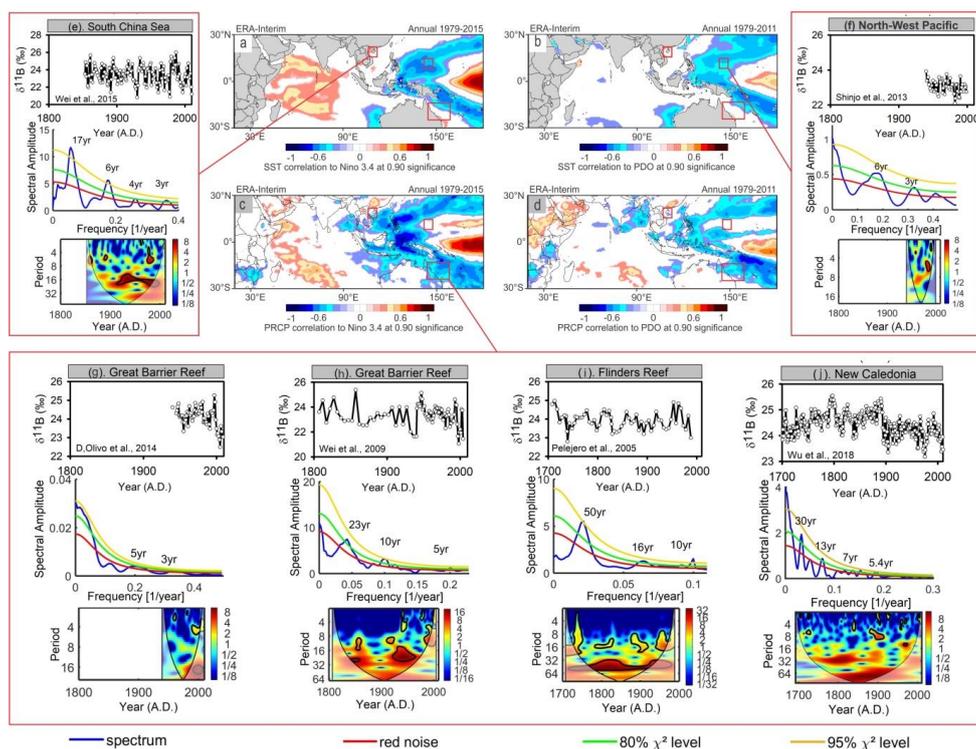
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408 Figure 2: The $\delta^{11}\text{B}$ records from the Pacific and the Atlantic Ocean corals. The black line represent the LOESS fit of all the data. Dashed red line represent
 409 the 95 percent confidence interval of the fit. Confidence band of the LOESS fit was determined using bootstrap in Matlab. The lower panel represents data
 410 density; the number of $\delta^{11}\text{B}$ data points for each year.



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413 Figure 3: The $\delta^{11}\text{B}$ derived pH records from the Pacific: (a) GBR, (b) SCS, (c) North-West Pacific and
414 from the Atlantic: (d) North West Atlantic. Red color solid curves represent theoretical pH for the sites
415 GBR, SCS and North-West Atlantic. Reconstruction of theoretical pH is discussed in section 2.2. Gray
416 envelopes represents uncertainty in the theoretical pH reconstruction. $\delta^{11}\text{B}$ derived pH records and
417 theoretical pH are compared with the Hector model derived pH projections (Hartin et al., 2016) of low
418 latitude ($<55^\circ$ Latitude) for various representative concentration pathway (RCP) scenarios.

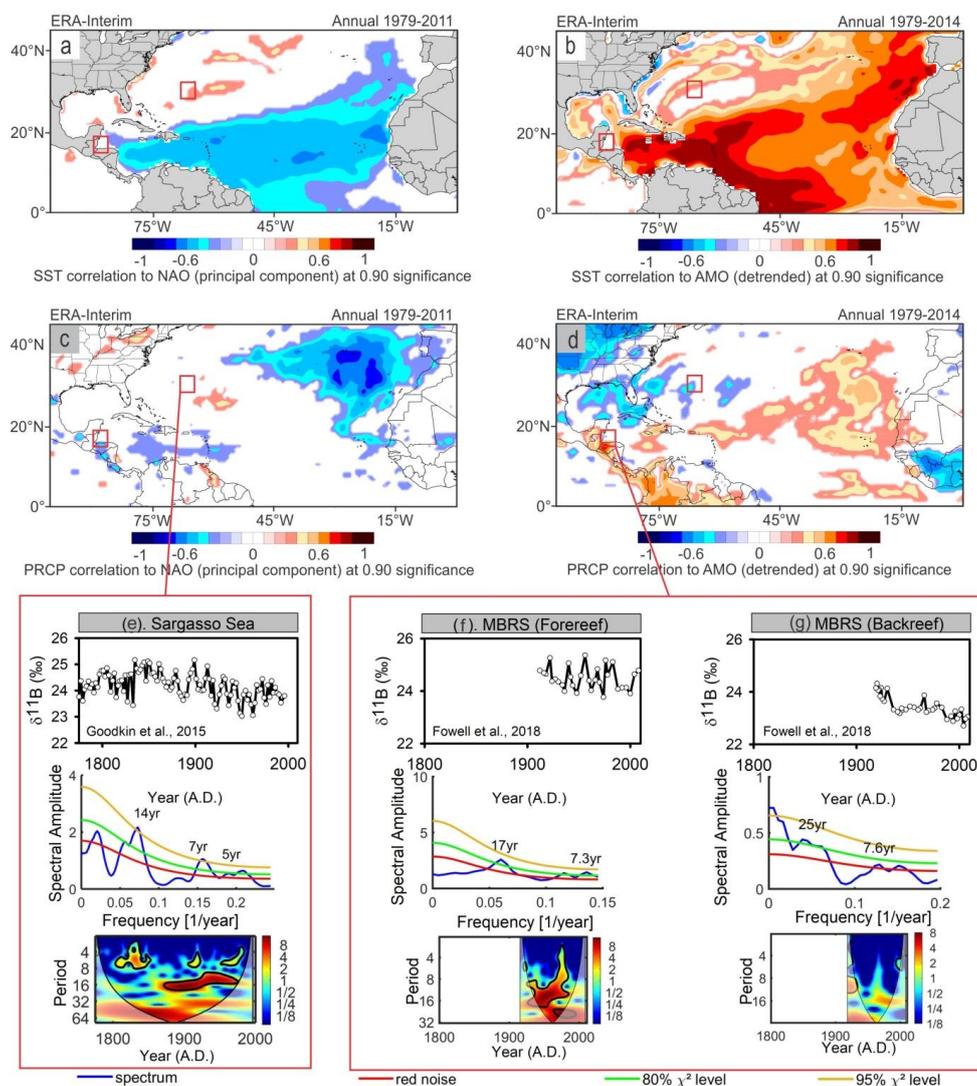


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421 Figure 4(l): Spatial correlation between records of (a) SST and Niño 3.4, (b) SST and PDO, (c)
 422 precipitation and Niño 3.4, (d) precipitation and PDO indices. Reanalysis ERA-Interim data of SST
 423 and precipitation records are used in the spatial correlation analysis. The regions of significant
 424 correlation are highlighted in color code at 90% significance level. Spatial correlation plot was
 425 generated from Climate Reanalyzer (<http://cci-reanalyzer.org>). Red colour square indicates the
 426 locations of the coral sites in the Pacific Ocean. The $\delta^{11}\text{B}$ records and their spectral and wavelet
 427 analysis from the sites: (e) SCS (Wei et al., 2015), (f) Guam Island (Shinjo et al., 2013), (g) GBR
 428 (D'Olivo et al., 2015), (h) GBR (Wei et al., 2009), (i) Flinders Reef (Pelejero et al., 2005) and (j) New
 429 Caledonia (Wu et al., 2018). Spectrum analysis were performed using MATLAB based Redfit program
 430 (Schulz and Mudelsee, 2002). Wavelet analysis decomposes time series in time and frequency
 431 space. Thick contour represents 5% significance level against red noise. The thin solid lines represent
 432 cone of influence. The color band highlights how periodicities vary with time. Wavelet analysis was
 433 performed using online MATLAB codes taken from Torrence and Compo (1998). The wavelet



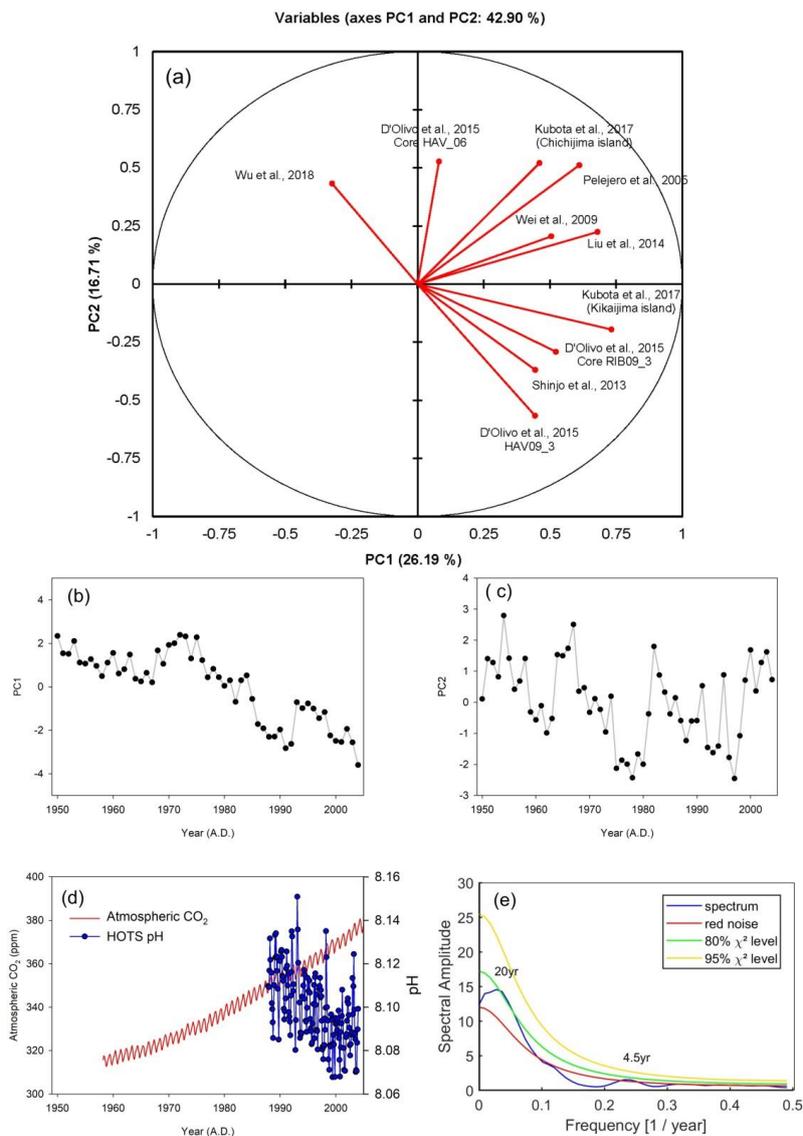
434 analyses were performed using online available MATLAB codes from Grinsted et al. (2004)
 435 (<http://grinsted.github.io/wavelet-coherence/>).
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 439 Figure 4(II): Spatial correlation between the records of (a) SST and NAO, (b) SST and AMO, (c)
 440 precipitation and NAO, (d) precipitation and AMO. The $\delta^{11}\text{B}$ records and their power spectrum and
 441 wavelet analysis were performed for the sites: (e) Sargasso Sea (Goodkin et al., 2015) and (f & j)
 442 MBRS (Fowell et al., 2018).



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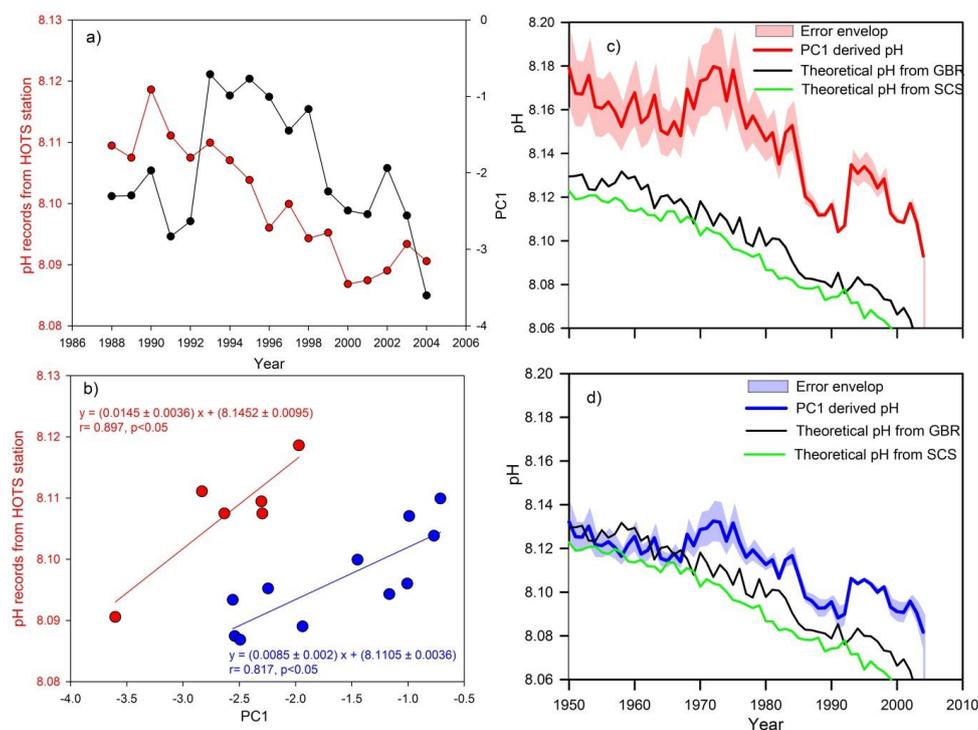


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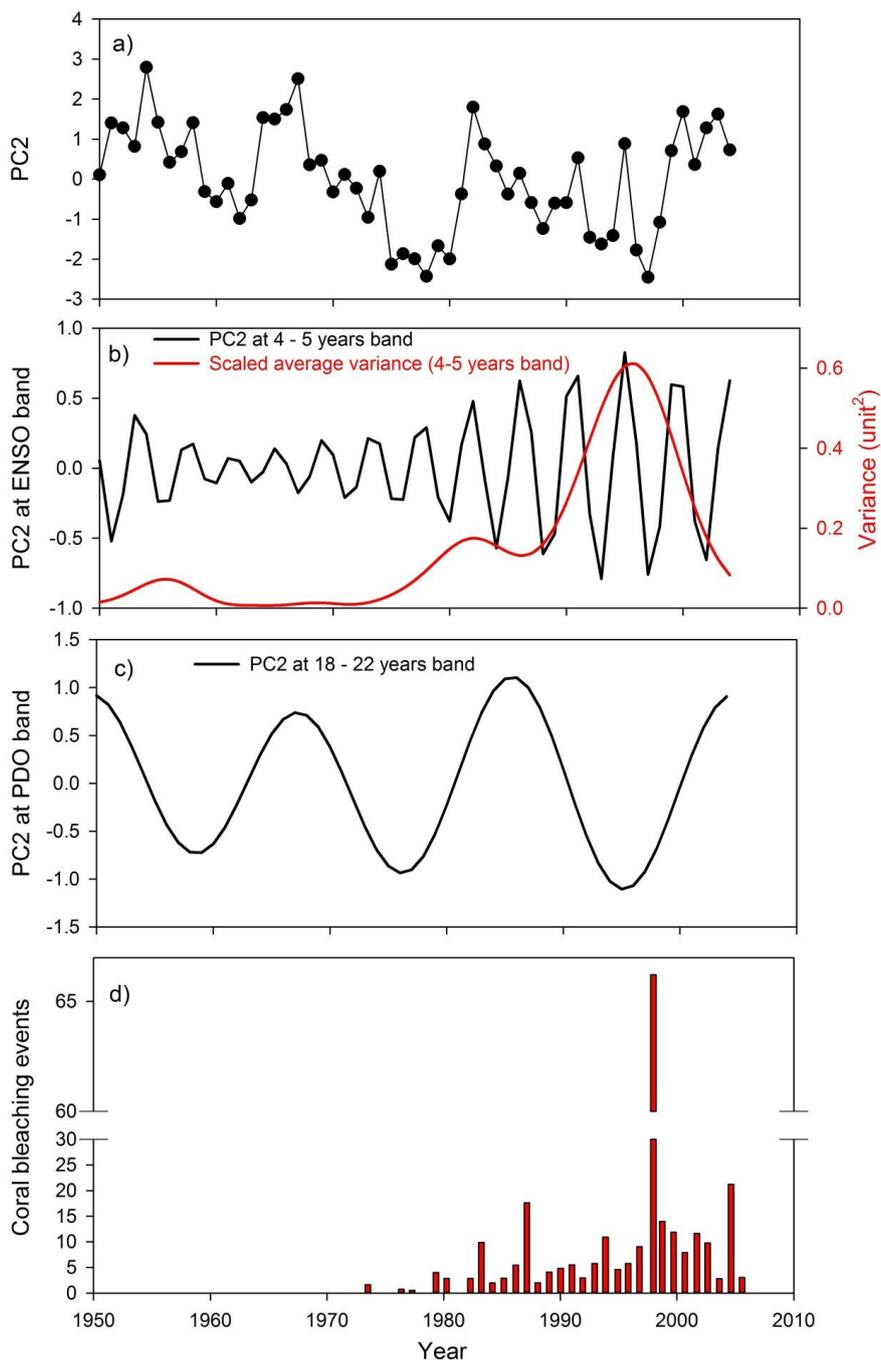
Figure 5: Biplot of principal components PC1 vs. PC2. The vectors length and directions show correlation between the factors and variables. PC1 and PC2 components explain ~43 % of the total variability in $\delta^{11}\text{B}$ records from the Pacific. Records of (b) first principal component (PC1 score) and (c) second principal component (PC2) derived from the principal component analysis of all the pacific records of $\delta^{11}\text{B}$ (1950 – 2004 AD). (d) Instrumental records of atmospheric CO₂ (red curve) and HOTS pH (blue dots) from 1950 to 2004.



452 (<https://www.esrl.noaa.gov/gmd/ccgg/trends/>) and pH records (blue line) from the time series station
 453 HOTS in the Pacific Ocean. (e) Power spectrum analysis of PC2 record. This shows significant (80%
 454 χ^2 level) periodicities of 4.5 years and 20 years.



455
 456 Figure: 6 a) Annual mean pH record from the HOTS station (1988 – 2004) is compared with PC1. (b)
 457 PC1 record is plotted with pH record from HOTS station (1988 – 2004). Based on the distribution of
 458 the data, two distinct trends are identified. These trends are compatible with linear fits with significant
 459 correlations. (c & d) pH was reconstructed based the PC1 time series in the regression equations.
 460 Solid (red and blue lines) represent mean pH and shade represents uncertainty associated with the
 461 mean (2σ). Black and green line represent the theoretical pH for GBR and SCS regions respectively.



462
463 Figure 7: a) PC2 time series and b) extracted signal of ENSO at 4 – 5 years band and c) PDO signal
464 at 18 – 22 years band. The amplitude of the ENSO signal shows large increase after 1970 d) Number
465 of coral bleaching events after Hughes et al. (2018).

466 Table 1: Details of published $\delta^{11}\text{B}$ records from Pacific and Atlantic Ocean

Location	Latitude, Longitude	$\delta^{11}\text{B}$ (‰) range (min – max)	pH range (min – max)	Boron isotope measurement	Time span (Years)	Resolution (Year)	Coral type	References
<i>Pacific Ocean</i>								
Great Barrier Reef	-18.84, 146.53	22.49 – 26.27	7.88 – 8.40	TIMS, MC-ICPMS	1940-2009	1	<i>Porites</i> sp.	D'Olive et. al., 2015
Great Barrier Reef	-16.68, 146.12	21.06 – 25.38	7.67 – 8.28	TIMS	1807-2004	1, 5	<i>Porites</i> sp.	Wei et. al., 2009
Flinders Reef	-17.5, 148.3	22.79 – 24.97	7.92 – 8.23	TIMS	1781-1990	5	<i>Porites</i> sp.	Pelejero et al., 2005
New Caledonia	-22.21, 166.15	23.18 – 25.54	7.98 – 8.30	MC-ICPMS	1692-2011	1	<i>Diploastrea heliopora</i>	Wu et al., 2018
South China Sea	19.283, 110.65	20.82 – 26.00	7.63 – 8.37	TIMS	1853-2011	1	<i>Porites</i> sp.	Wei et. al., 2015
South China Sea	18.2, 109.499	22.16 – 24.91	7.83 – 8.22	MC-ICPMS	1840-2000	4	<i>Porites</i> sp.	Liu et. al., 2014
Guam Island	13.6, 144.80	22.10 – 23.92	7.82 – 8.08	MC-ICPMS	1940-1999	1	<i>Porites</i> sp.	Shinjo et. al., 2013
Kikaijima and Chichijima island	28.3, 130.0 27.1, 142.2	23.33 – 25.02	8.00 – 8.23	MC-ICPMS	1910-2007	5	<i>Porites</i> sp.	Kubota et.al., 2017
<i>Atlantic Ocean</i>								
Sargasso Sea	32.318, -64.717	23.02 – 25.16	7.96 – 8.25	MC-ICPMS	1775-1996	2	<i>Diploastrea heliopora</i>	Goodkin et. al., 2015
Belize Mesoamerican Barrier Reef	16.137, -88.252 16.140, -88.260	22.70 – 25.36	7.91 – 8.28	MC-ICPMS	1912-2008	1-6	<i>Siderastrea siderea</i>	Fowell et al., 2018

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Table 2: Periodicities in $\delta^{11}\text{B}$ and climate indices

Location / Indices	Periodicities			References
	Low	Intermediate	High	
Great Barrier Reef	3, 5			D'Olivo et al., 2015
Great Barrier Reef	5	10	23	Wei et al., 2009
Flinders Reef		10, 16	50	Pelejero et al., 2005
New Caledonia	5.4, 7	13	30	Wu et al., 2018
South China Sea	3, 4, 6	17		Wei et al., 2015
Guam Island	3, 6			Shinjo et al., 2013
Sargasso Sea	5, 7	14		Goodkin et al., 2015
MBRS	7.3, 7.6	17	25	Fowell et al., 2018
Climate indices				
ENSO	2.4, 2.8, 3.6, 5.6			
PDO	3.3, 6	20	40	
NAO	1.5, 7.6			
AMO	5.7	10.5	23.8	



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