



# Spatiotemporal heterogeneity in the increase of ocean acidity extremes in the Northeast Pacific

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**Abstract.** The acidification of the ocean (OA) increases the frequency and intensity of ocean acidity extreme events (OAXs), but this increase is not occurring homogeneously in time and space. Here we use daily output from a hindcast simulation with a high-resolution regional ocean model coupled to a biogeochemical-ecosystem model (ROMS-BEC) to investigate this heterogeneity in the progression of OAX in the upper 250 m of the Northeast Pacific from 1984 to 2019. We focus on the

- 5 temporal and spatial changes in OAX using a relative threshold approach and using a fixed baseline reflecting the initial conditions. Concretely, conditions are considered extreme when the local hydrogen ion concentration ( $[H^+]$ ) exceeds the 99<sup>th</sup> percentile of the  $[H^+]$  distribution of the baseline simulation where atmospheric CO<sub>2</sub> was held at its 1979 level. Within the 36 years of our hindcast simulation, the increase in atmospheric CO<sub>2</sub> causes a strong increase in OAX throughout the upper 250 m, but most accentuated near the surface. On average across the entire Northeast Pacific, for every additional 10  $\mu$ atm of CO<sub>2</sub>
- 10 in the atmosphere, OAXs occupy an additional 6.3% of the upper 250 m depth, last 7.6 days longer, and are 0.18 nmol L<sup>-1</sup> ( $\approx$  -0.006 pH units) more intense. This causes the OAXs to occupy at the end of the simulation a more than 10-times larger volume. The more than 11-fold increase in length, and the strong increase in the number of extreme days per year causes 88% of the surface area in 2019 to experience near permanent extreme conditions. Finally, the model simulates a more than 6-fold intensification of the OAXs, causing also the intensity of the events with return periods of 10 years or more to increase by
- 15 more than 80%. Superimposed on these overall trends are very substantial spatial and temporal differences in these changes. The fraction of the volume identified as extreme across the top 250 m increases in the Central Northeast Pacific up to 160times, while the deeper layers of the nearshore regions experience "only" a 4-fold increase. Throughout the upper 50 m of the Northeast Pacific, OAXs increase relatively linearly with time, but sudden rapid increases in yearly extreme days and OAX duration are simulated to occur in the thermocline of the Central Northeast Pacific. These differences largely emerge from
- 20 the large spatial differences in the magnitude and nature of variability in [H<sup>+</sup>], with the transition between the rather variable thermocline waters of the Offshore Northeast Pacific and the very stable waters of the Central Northeast Pacific causing a very sharp transition in the occurrence of OAX. This transition is caused by the limited offshore reach of offshore propagating eddies that are the dominant driver of OAX in the Northeast Pacific. As the OAXs become more extreme, more of them also become undersaturated with respect to aragonite ( $\Omega_A < 1$ ), i.e., become corrosive. In the final year of our hindcast, we find
- 25 that below 100 m OAXs are characterized by corrosive conditions across a wide stretch of the region offshore of the U.S. and





Canadian Coasts. The spatially and temporal heterogeneous increases in OAX, including the abrupt appearance of extremes, likely have negative effects on the ability of marine organisms to adapt to the progression of OA and its associated extremes.

## 1 Introduction

- Ocean uptake of anthropogenic carbon dioxide (CO<sub>2</sub>) from the atmosphere is the main driver of the ongoing surface ocean
  acidification (OA), that is the long-term increase in the hydrogen ion concentration [H<sup>+</sup>] and the decreases in pH (with pH=-log([H<sup>+</sup>])) and aragonite saturation state (Ω<sub>A</sub>) in the surface ocean (Hoegh-Guldberg et al., 2018; Bindoff et al., 2019; Doney et al., 2009; Caldeira and Wickett, 2003). These trends are bound to increase the occurrence of ocean acidity extreme events (OAXs). But how such extremes progress and what this means in terms of their average duration, frequency, and intensity, has only been analyzed by a handful of model-based studies so far (Gruber et al., 2021; Burger et al., 2020; Hauri et al., 2013a;
  Negrete-García et al., 2019), primarily due to the lack of long and high spatiotemporal resolution observational records of
  - ocean carbonate chemistry variables.

OAXs are defined as either rare and unusually high (low) [H<sup>+</sup>] (pH,  $\Omega_A$ ) events (Desmet et al., 2022; Gruber et al., 2021; Burger et al., 2020, 2022) or events when the [H<sup>+</sup>] concentration (pH,  $\Omega_A$ ) is above (below) a given absolute threshold known

- 40 to be harmful to certain marine organisms (Hauri et al., 2013a). The rareness of events is usually determined by requiring events to cross a "extreme" relative threshold, often determined from a certain percentile (e.g., 1<sup>st</sup> or 99<sup>th</sup>) of a cumulative frequency distribution (Seneviratne et al., 2012; Gruber et al., 2021). The frequency distribution itself is obtained by sampling the environmental conditions over a certain baseline period (Oliver et al., 2021). Irrespective of the choice of absolute or relative thresholds to identify extremes, all studies conducted so far have confirmed that OAXs have become already more frequent,
- 45 longer, and more intense since the preindustrial era and that these trends will continue in the future (Burger et al., 2020; Gruber et al., 2021; Hauri et al., 2013a). They have also confirmed that the main driver of these changes is the increase in atmospheric  $CO_2$  driving an increase in the surface ocean concentration of anthropogenic  $CO_2$ . For example, between the preindustrial period and the recent decades, the number of surface extreme days for [H<sup>+</sup>] across the global surface ocean was shown to increase from ~4 to ~300 days a year for OAX defined using a relative threshold on a fixed preindustrial baseline. A similar increase
- 50 was simulated at 200 m depth. While this global-scale increase is very large, it was found to occur relatively smoothly in time (Burger et al., 2020; Gruber et al., 2021). Yet, this might not be the case at the regional scale, where variability is larger. But so far, limited emphasis has been given to such potential spatial and temporal heterogeneities in the progression of OAX, and the potential for abrupt changes. This is in part a consequence of the fact that the global studies used relatively coarse-resolution Earth system models, which do not resolve mesoscale variability that has been shown to be rather relevant for generating OAX
- 55 (Desmet et al., 2022).

In fact, such abrupt changes in OAX have been detected at the regional scale in the California and Humboldt Current Systems (Hauri et al., 2013a; Franco et al., 2018) and in the Southern Ocean (Hauri et al., 2015; Negrete-García et al., 2019). These





OAXs, defined in these studies as undersaturation events where Ω<sub>A</sub><1, exhibit abrupt onsets, non-linear increases, and sudden</li>
shoalings. For example, in the nearshore bottom waters off California, Hauri et al. (2013a) showed that while the median duration of such undersaturation events increased only modestly up to the year 2000, these events abruptly become near-permanent in the ensuing decades. Such abrupt increase may also occur for OAX defined using relative thresholds, i.e., when the environmental conditions suddenly shift to conditions outside the previously established variability ranges. Such an abrupt increase in OAX could have especially deleterious effects on marine organisms since they are not only exposed to conditions that are
outside the variability that they are adapted to (Vargas et al., 2017, 2022; Kroeker et al., 2020; Rivest et al., 2017; Cornwall et al., 2020), but are also forced to transition to the new conditions at a speed that likely exceeds their capacity to adapt (Gruber et al., 2021).

The rate and potential abruptness of the increase in OAX in response to the rise in atmospheric CO<sub>2</sub> is likely to vary between regions and depths owing to differences in the rate of change of the underlying variables of the marine carbonate system (Ma et al., 2023) and because of differences in the magnitude and type of variability of these variables (Sutton et al., 2019; Carter et al., 2019; Keller et al., 2014). Owing the generally Gaussian-type distribution of environmental conditions, the same shifts in the underlying distribution impact extremes very differently in high versus low variability regions. We generally expect that regions characterized by large variability tend to experience smaller increases in OAX than regions with low variability. The same underlying concept is captured by the time of emergence (ToE) concept, which is the time for the trend in OA to exceed the background variability (Sutton et al., 2019; Turk et al., 2019; Carter et al., 2019; Keller et al., 2014). This means that after the ToE has passed, the change is clearly detectable and the conditions are, on average, very different from anything in the

past. Thus, the ToE in open ocean sites that are characterized by low variability tend to be much shorter than those in coastal sites, where variability is high (Sutton et al., 2019; Turk et al., 2019; Carter et al., 2019; Keller et al., 2014). This also means

80 that we expect the largest changes in OAX in the open ocean regions characterized by low variability. For abruptness, the relationship with variability is not so clear, since this metric strongly depends on the details of the variability and of the nature of the underlying change of the marine carbonate system variable of interest. Still, low variability regions might be more prone to abrupt changes than those characterized by high variability.

- 85 Of particular relevance with respect to OAX is the eastern North Pacific, due to its vulnerability to OA. Waters naturally low in pH and  $\Omega_A$  make up the upper 250 m depth, particularly inshore along the Alaskan, Canadian, and U.S. West Coasts where the saturation horizon with regard to aragonite is naturally shallow (Jiang et al., 2015; Byrne et al., 2010; Feely and Chen, 1982; Feely et al., 2008). Besides, observation and model-based studies found rapid acidification in those regions (Jiang et al., 2019; Gruber et al., 2012; Hauri et al., 2013b; Turi et al., 2016), threatening important marine ecosystems and their services
- 90 since the region hosts highly productive waters and important fisheries, including OA sensitive species (Mundy, 2005; Messié et al., 2009; Pauly and Christensen, 1995; Bednaršek et al., 2014, 2017, 2020; Long et al., 2016; Swiney et al., 2016; Williams et al., 2019).





Spatial patterns and regional drivers of OAX in the Northeast Pacific have been investigated recently in a regional ocean
model that explicitly resolves mesoscale variability (Desmet et al., 2022). Within the upper 100 m, westward propagating mesoscale cyclonic eddies were found to drive the largest and longest tracked OAX, defined as combined unusually low pH-Ω<sub>A</sub> space-time events, revealing the key role of mesoscale variability in OAX formation and sustenance. Hence, in the California current system (CCS) as well as hundreds of kilometers offshore, OAXs are shaped by the extensive mesoscale activity of the CCS (Desmet et al., 2022; Zhao et al., 2021; Chabert et al., 2021; Combes et al., 2013; Nagai et al., 2015; Amos
et al., 2019; Chenillat et al., 2016). Near the U.S. West Coast, shallow and intense OAXs emerge from seasonal upwelling, which confers high pH and Ω<sub>A</sub> natural variability to the waters (Desmet et al., 2022; Fassbender et al., 2011, 2018; Turi et al., 2014). Therefore, leading drivers of OAX in the Northeast Pacific differ across space, with different scales of variability predominating, likely to drive a spatially heterogeneous temporal progression of OAX in response to the rise in atmospheric CO<sub>2</sub>.

In the present study, we quantify the rate, the abruptness, and the heterogeneity of the increase in OAX across the upper ocean of the Northeast Pacific. We thereby use a high-resolution mesoscale-resolving oceanic model, focus on the period from 1984 through 2019, and adopt a relative threshold definition of the OAX on the basis of the [H<sup>+</sup>] concentration. We also attribute which fraction of the change is due to the rise in atmospheric CO<sub>2</sub>.

## 2 Methods

## 110 2.1 Simulations

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This study is based on the UCLA-ETH version of the Regional Oceanic Modeling System (ROMS) (Shchepetkin and McWilliams, 2005) coupled to the biogeochemical ecosystem model BEC (Frischknecht et al., 2018; Moore et al., 2013). We use the same model configuration and forcing as described by Desmet et al. (2022) and we refer the reader to that study for further details. An important feature of our model configuration is the telescopic grid that resolves mesoscale features across a substantial fraction of the Northeast Pacific with highest grid refinement near the U.S. West Coast pole of the grid (Figure 1). At the same

time, the model simulates the circulation of the entire Pacific, avoiding the need to provide lateral boundary conditions except at a few places in the Southern Ocean.

We run two simulations with different carbon forcings. The first one corresponds to the simulation used by Desmet et al. (2022) and consists of a hindcast simulation (HCast) from 1979 through 2019, where both atmospheric  $pCO_2$  and the DIC con-

- 120 centration at the lateral southern open boundary of the model are prescribed to increase according to observations. The second simulation is a control simulation (CCons), where we kept the long-term mean atmospheric  $pCO_2$  and the DIC concentration at the lateral southern boundary at the 1979 levels by linearly detrending them. This simulation was also run for the years 1979 through 2019. We discard the first five years and then use daily mean outputs from 1984 to 2019 for both simulations for our analysis of the extreme events. The hydrogen ion concentration ([H<sup>+</sup>], at the total scale) and the saturation state of aragonite
- 125 ( $\Omega_A$ ) are computed offline using the MOCSY 2.0 routine as described in Desmet et al. (2022).



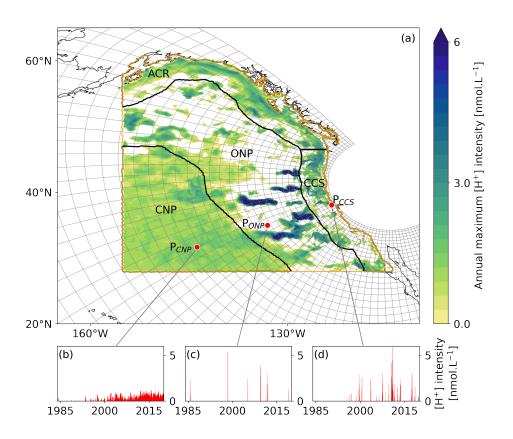


We divide the Northeast Pacific region (28°-62°N; 105°-155°W) into a total of four regions (Figure 1a). Two are coastal regions extending up to 300 km off the coast, namely the CCS (28°- 46.5°N) and the Alaskan Coastal Region (ACR; north of 46.5°N). The choice of 300 km reflects on the one hand the average width of the nearshore band of high particulate organic carbon concentrations (Amos et al., 2019), and on the other hand the boundary inshore of which the majority of westward propagating mesoscale eddies tend to form (Nagai et al., 2015; Chenillat et al., 2016; Amos et al., 2019). The other two regions 130 are open ocean regions with the first one denoted as the "Offshore Northeast Pacific" (ONP) since it is impacted by mesoscale eddies that originate from the nearshore regions and propagate all the way into this open ocean region. The second is the Central Northeast Pacific (CNP) that shows no evidence of this coastal imprint. We delineate the ONP and CNP regions by computing the eddy fronts at 100 m and 200 m, respectively and then taking the average of the two (see section 2.4 below for

further details). 135







**Figure 1.** Map of the analysis domain and the selected subregions, and key properties of the diagnosed OAX. (a) Map of the Northeast Pacific with the telescopic grid of the model plotted in grey for every  $10^{th}$  grid cell. The black contours delimit the four selected subregions, i.e., the two coastal regions inshore of 300 km, namely the Alaskan Coastal Region (ACR) and the California Current System (CCS), and the two open ocean regions, i.e., the Offshore Northeast Pacific (ONP) and the Central Northeast Pacific (CNP). The domain of analysis is denoted by the orange contour line. The annual maximum intensity of the simulated OAXs in year 2014 at 100 m depth is plotted on top. White regions indicate that no OAX occurred in that year at this depth. (b-d) Time series of [H<sup>+</sup>] intensity at 100 m depth at the three locations depicted by red points in (a), i.e., (left) P<sub>CNP</sub> point (31.66°N-143.77°W), (middle) P<sub>ONP</sub> point (34.97°N-133.07°W), and (right) P<sub>CCS</sub> point (38.08°N-123.32°W).

## 2.2 Model evaluation

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A thorough evaluation of the climatological distribution of key physical and carbon variables simulated in the hindcast simulation (HCast) was provided by Desmet et al. (2022). This evaluation as well as that of the simulated daily surface variability gave excellent results, except for a tendency of the model to produce too low pH and  $\Omega_A$  levels in the thermocline of the CCS. Here we further evaluate the surface OA trends in pH and  $\Omega_A$  of the model against observations (Table 1).

We first evaluate regionally averaged surface pH trends in the North Pacific against trends derived from SOCATv2 data (Lauvset et al., 2015) (Table 1). For better comparison, we spatially average surface pH over the biomes used in Lauvset et al. (2015) and then compute the linear trend on the spatially averaged time series. The modeled surface pH in the subtropical North



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Pacific decreases by 0.0015 per year from 1981 to 2011, which is within the range of the observed trend of -0.0016  $\pm$  0.0002 yr<sup>-1</sup> (Lauvset et al., 2015). The model's trend of -0.0016 pH unit yr<sup>-1</sup> from 1991 to 2011 in the subpolar North Pacific, although overestimated compared to observations, is also within the range of the observed trend of -0.0013  $\pm$  0.0005 yr<sup>-1</sup> (Lauvset et al., 2015).

**Table 1.** Linear trends in pH and  $\Omega_A$  (per decade) for the two north Pacific biomes used in Lauvset et al. (2015) (subtropical and subpolar) and six stations (line P stations and ALOHA; see Appendix Figure B1). Given are the modeled and observed trends, together with their two standard deviation credible intervals (95% CrI).

Location	Time period	ROMS	S-BEC	Obser	References	
		pH unit.decade-1	$\Omega_A$ unit.decade <sup>-1</sup>	pH unit.decade-1	$\Omega_A$ unit.decade <sup>-1</sup>	
i) Regional average				•		
Subtropical north Pacific	1981-2011	$-0.0148 \pm 0.0003$	-	$-0.016 \pm 0.002$	-	Lauvset et al. (2015)
Subpolar north Pacific	1991-2011	$-0.0161 \pm 0.0008$	-	$-0.013 \pm 0.005$	-	Lauvset et al. (2015)
ii) Stations						
P4	1990-2019	$-0.0166 \pm 0.0007$	$\textbf{-0.057} \pm 0.005$	$-0.011 \pm 0.014$	$\textbf{-0.04} \pm 0.06$	Franco et al. (2021)
P12	Feb. 1992-Jun. 2019	$-0.0204 \pm 0.0006$	$\textbf{-0.080} \pm 0.006$	$-0.016 \pm 0.006$	$\textbf{-0.06} \pm 0.04$	Franco et al. (2021)
P16	May 1990-Mar. 2018	$-0.0200 \pm 0.0006$	$\textbf{-0.083} \pm \textbf{0.007}$	$-0.017 \pm 0.008$	$\textbf{-0.08} \pm 0.04$	Franco et al. (2021)
P20	1990-2019	$-0.0180 \pm 0.0005$	$\textbf{-0.051} \pm 0.005$	$-0.014 \pm 0.006$	$\textbf{-0.04} \pm 0.04$	Franco et al. (2021)
P26	1990-2019	$-0.0180 \pm 0.0005$	$\textbf{-0.048} \pm 0.005$	$-0.013 \pm 0.004$	$\textbf{-0.04} \pm 0.02$	Franco et al. (2021)
ALOHA	1988-2012	$-0.0161 \pm 0.0003$	$\textbf{-0.090}\pm0.002$	$-0.016 \pm 0.001$	$\textbf{-0.084} \pm \textbf{0.011}$	Bates et al. (2014)

We additionally evaluate our model simulated pH and  $\Omega_A$  surface trends against time series data collected at station ALOHA (Bates et al., 2014), as well as against the line P time series (Franco et al., 2021). All the simulated trends are within the range of observed trends, except the pH trend at station P26 (Table 1). The average modeled surface pH ( $\Omega_A$ ) trend across the five line P stations is -0.0019 yr<sup>-1</sup> (-0.006 yr<sup>-1</sup>) against -0.0014 yr<sup>-1</sup> (-0.005 yr<sup>-1</sup>) in Franco et al. (2021).

Overall, our model simulates pH and  $\Omega_A$  surface trends within the range of the trends that have been observed during the last four decades, giving us confidence in the analysis of the progression of acidity extreme events.

# 2.3 Ocean acidity extremes (OAX)

- We define ocean acidity extreme events (OAXs) as temporally connected grid cells, for which  $[H^+]$  exceeds the 99<sup>th</sup> percentile of temporally aggregated daily  $[H^+]$  from 1984 to 2019 at a given location (similar as in Gruber et al., 2021). To determine the 99<sup>th</sup> percentile threshold, we used the CCons simulation where the long-term mean atmospheric CO<sub>2</sub> was kept at the 1979's levels. In other words, we used a fixed baseline approach where the initial conditions of the late 1970s were used as the reference period. This choice of a reference period is somewhat arbitrary, but the late 1970s/early 1980s represent for
- 160 many oceanographic parameters the first period for which we have global-scale observation based estimates (see e.g., Ma et al. (2023)). This temporally fixed threshold was then used to detect OAXs in both the CCons and HCast simulations. We focus our analysis on OAX occurring in the upper 250 m of the water column.





We derive three local metrics, namely (i) yearly extreme days (in days; number of days per year above the 99<sup>th</sup> percentile of  $[H^+]$ ), (ii) annual mean event duration (in days; the average number of consecutive days above the 99<sup>th</sup> percentile of single events within a year) and (iii) annual maximum intensity (in nmol  $L^{-1}$ ; maximum [H<sup>+</sup>] anomaly with respect to the percentile 165 threshold). These metrics are computed at three depths, i.e., the surface layer in direct interaction with the atmosphere, 100 m corresponding to the transition from the euphotic zone to the twilight zone, and 200 m, corresponding to the upper thermocline. Note that while the truncation of extremes between years alters the results for duration, it allows for the calculation of annual extreme-event characteristics. We additionally derive an integrative metric, namely the yearly volume fraction (in %; fraction of the volume per year above the 99th percentile for [H<sup>+</sup>]), computed separately for each of the four regions of the Northeast 170 Pacific depicted in Figure 1 (ACR, CCS, ONP and CNP) and three depth bins (0-50 m, 50-100 m and 100-250 m). Additionally,

we compute in each of these regions the fraction of the volume of the  $[H^+]$  extremes that is undersaturated with regard to aragonite ( $\Omega_A < 1$ ) at the time of the extreme. Within the OAX with undersaturated conditions, we further identify those that are supersaturated ( $\Omega_A \ge 1$ ) in the CCons simulation. We refer to this last fraction as the fraction of newly undersaturated OAXs.

#### 2.4 Return periods, time of emergence (ToE) and eddy front 175

We characterize the return periods of different  $[H^+]$  intensity levels using the generalized extreme value distribution G (Coles, 2001):

$$G(z) = \exp\left[-\left(1+\xi\frac{z-\mu}{\sigma}\right)^{-\frac{1}{\xi}}\right], \quad \text{ for } 1+\xi\frac{z-\mu}{\sigma} > 0,$$

- where  $\mu, \sigma$ , and  $\xi$  are the location, scale, and shape parameters, respectively. We extract the annual maxima [H<sup>+</sup>] at each grid cell and fit G to the annual maximum data for the 1984-1998 and 2005-2019 periods respectively using the stats.genextreme 180 function from Scipy. We then compute at each location the return periods (in years) for 24 discrete return intensity levels ranging from 0.05 to 6 nmol  $L^{-1}$ . We focus on return periods shorter than a century and set all longer return periods to 200 years prior to computing the spatial median, 40<sup>th</sup>, and 60<sup>th</sup> percentile return periods within the ACR, CCS, ONP, and CNP regions at the surface and at 100 m and 200 m depth. The method is found to be robust to the number of data points to which G is fitted, i.e., 15 datapoints for each period in our study, given the small standard deviation (1.4 years) of the return periods 185
  - computed for the CCons scenario on 15, 20, and 25 years (respectively 15, 20, and 25 datapoints; Appendix Figure B2).

We compute the time of emergence (ToE) as a measure of the point in time when the linear long-term trend signal exceeds the 99th percentile threshold used to detect OAX. We first compute at each individual grid cell a linear regression from the daily [H<sup>+</sup>] data from 1984 through 2019 from the HCast scenario, assuming the trend signal to be linear over this period. We

then calculate the year when this linear trend exceeds the 99<sup>th</sup> percentile threshold computed from the CCons scenario daily 190 data from 1984 to 2019. This is done at each location at the surface and at 100 m and 200 m depths.

At both 100 m and 200 m depth we define an eddy front based on the westward extent of detected eddy-driven OAXs in Desmet et al. (2022). This eddy front measures the farthest distance from the coast at which eddy-induced variability significantly alters the [H<sup>+</sup>] threshold (99<sup>th</sup>) value in our simulation. Such alteration occurs when eddy-induced variability accounts for more than 1% of the time period at a given location, in which case the threshold depends on the [H<sup>+</sup>] carried by mesoscale

195





eddies rather than background variations at that location (Appendix Figure A1). Further offshore of this front, the threshold of the offshore regime is not affected anymore by the mesoscale imprint of nearshore conditions. Detailed methodology on the calculation of the depth-dependent eddy front can be found in Appendix A.

3 Results

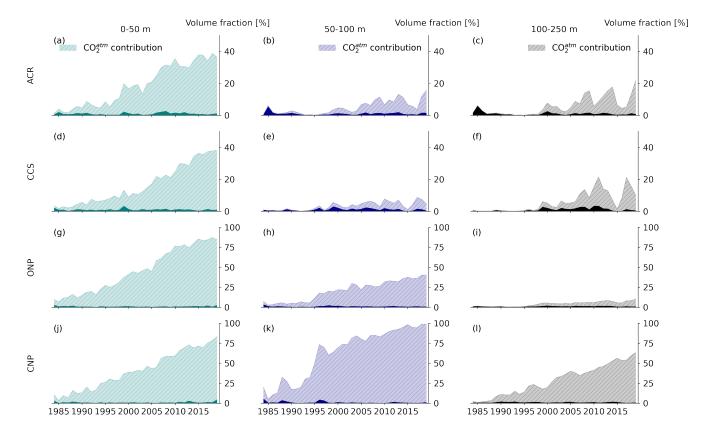
# 200 3.1 Progression of OAX in the Northeast Pacific

Between 1984 and 2019, the yearly volume fraction characterized by extreme [H<sup>+</sup>] conditions (OAX) in the upper 250 m increases manifold, yet spatially varied across the Northeast Pacific (Figure 2). In the upper 50 m, this volume fraction increases from a few percent in the early 1980s to around 40% in the two coastal regions (Figure 2a,d), and to about 85% in the open ocean regions (Figure 2g,j), representing a between 8 and 15-fold increase over the 36 years of our simulation. In the 50-100

- 205 m depth range, the regional differences are even larger. While the Central Northeast Pacific (CNP) approaches near permanent extreme conditions, the other regions experience a more modest increase (Figure 2b,e,h,k). This strong regional difference persists in the 100-250 m depth range, with the CNP region experiencing an increase to a volume fraction of OAX of more than 50%, while the volume fraction in the adjacent ONP open ocean region increases to only about 10%, similar to the changes seen in the two coastal regions (Figure 2c,f,i,l). Furthermore, the temporal progression differs across regions. The increase is
- 210 mainly linear in the surface layer, while the subsurface experiences more abrupt transitions and stronger year-to-year variability. Striking is the step increase in OAX in the subsurface layers of the two coastal regions around the year 1995 (Figure 2b,c,e,f). This is also seen in the open ocean regions (Figure 2h,k). The strongest year-to-year variability is found in the 100-250 m range of the two coastal regions, with a near collapse of the OAX volume fraction in the subsurface CCS and ACR in 2015, concomitant with the strong El Niño 2014/16 (Figure 2c,f).







**Figure 2.** Time series of the yearly volume fraction characterized by  $[H^+]$  extremes (OAX) for the four different regions of the Northeast Pacific shown in Figure 1 (rows) and three different depth sections (from left to right: 0-50 m, 50-100 m and 100-250 m depth). Dark and light colours depict the OAX volume fraction in the CCons and HCast scenario, respectively, with the difference between the two denoting the impact of the rise in atmospheric CO<sub>2</sub> (hatched area). Note the different scales of the top two (0-50%) and bottom two rows (0-100%).

- 215 Many of the OAX below the top 50 m, and especially those in the coastal regions are also characterized by undersaturated (corrosive) conditions with regard to the CaCO<sub>3</sub> mineral aragonite, i.e., have  $\Omega_A < 1$  (Table 2). This joint stress from extremely low pH and corrosive conditions is expected to be particularly harmful for ocean organisms that form shells out of aragonite such as pteropods (Bednaršek et al., 2014; Feely et al., 2018). While such corrosive conditions in OAX are rare in the upper 50 m of the ocean, between 66% and 100% of the OAX events are corrosive below 50 m in the two coastal regions. Also in
- 220 the Offshore Northeast Pacific below 100 m, the majority (60%) of the OAX have such corrosive conditions (Table 2). While the majority of these events would have been corrosive even in the absence of any increase in atmospheric  $CO_2$  in the 100 to 250 depth layer, about an eighth (CCS) to a third (ACR) of the corrosive OAX between 50 and 100 m depth in the two coastal regions have become corrosive over the course of the 41 years of our simulation (Table 2). There, 10% and 21%, respectively, of the volume of OAX has become undersaturated, while these waters would have stayed supersaturated without the increase
- in atmospheric CO<sub>2</sub>. In contrast to the subsurface waters in the ACR, CCS, and ONP regions, the OAX in the subsurface waters of the CNP remain supersaturated.



230



These differences in corrosiveness of the OAX reflect the distribution of the climatological saturation horizon (depth level where  $\Omega_A = 1$ ) and how this horizon shoals in response to the invasion of anthropogenic CO<sub>2</sub>. With the atmospheric CO<sub>2</sub> kept at the 1979 level, this horizon sits below 300 m in the CNP and ONP regions, but shoals to less than 60 m in the nearshore coastal regions. Still, the saturation horizon sits below 100 m in more an 80% of the coastal areas (Appendix Figure B3). With the increase in atmospheric  $CO_2$  this horizon shoals by 50 m on average, bringing the saturation horizon into the top 100 m, leading to many additional corrosive OAX.

Table 2. Fraction (in %) of the OAX volume that is characterized by undersaturated conditions with regard to aragonite averaged over 1984-2019 for the four different regions of the Northeast Pacific shown in Figure 1 and for three different depth layers. Numbers in the " $\Omega_A$  newly < 1" column give the fraction of the OAX volume that is newly undersaturated with regard to aragonite. This is computed by identifying the fraction of the OAX volume that is undersaturated in the HCast simulation but supersaturated in the CCons simulation where atmospheric CO<sub>2</sub> was kept at its 1979's value.

	0-50 m		50-100 m		100-250 m	
	$\Omega_A$ newly < 1	$\Omega_A < 1$	$\Omega_A \text{ newly} < 1$	$\Omega_A < 1$	$\Omega_A$ newly < 1	$\Omega_A < 1$
Alaskan Coastal Region (ACR)	<1	1	21	66	4	100
California Current System (CCS)	<1	2	10	81	1	100
Offshore Northeast Pacific (ONP)	≪1	≪1	1	4	5	60
Central Northeast Pacific (CNP)	0	0	0	0	<1	1

#### 3.2 Role of rise in atmospheric CO<sub>2</sub>

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The strong increase in the OAX with time is almost entirely attributable to the increase in atmospheric CO<sub>2</sub> (Figure 2). If atmospheric CO<sub>2</sub> was held at the 1979 levels, the volume of OAX would have exhibited no significant trend (dark colored areas), but only would have fluctuated from year-to-year at a level of a few percent in all regions and depth layers. Concretely, depending on the depth layer and region, the fraction of the volume occupied by OAXs in the last 15 years of the hindcast is 4 to 160-fold larger than in the CCons simulation, where atmospheric CO<sub>2</sub> did not increase (Figure 2).

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In order to assess the impact of the rise in atmospheric  $CO_2$  in more detail and to also diagnose its impact on the duration and the annual maximum intensity of the OAX, we analyze these metrics as a function of atmospheric  $CO_2$  rather than as a function of time (Figure 3). This permits to scale the various metrics as a function of the main driver of change. We thereby combine the two coastal and two open ocean regions.





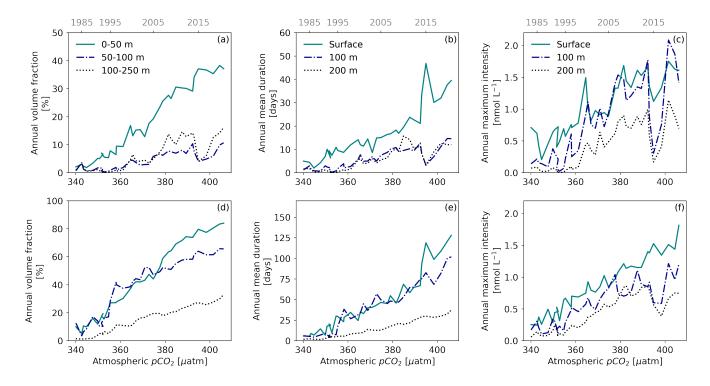
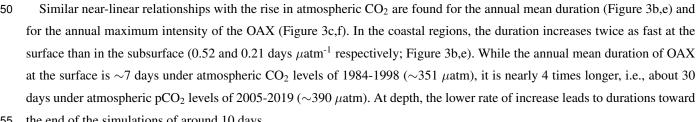


Figure 3. OAX characteristics as a function of atmospheric CO<sub>2</sub> between 1984 and 2019 in the (top row) two coastal and (bottom row) two open ocean regions of the Northeast Pacific analysis domain. (a,d) Annual fraction of the [H<sup>+</sup>] extreme volume in three different depth layers (0-50 m, 50-100 m and 100-250 m depth). (b,e) Annual mean event duration (days) and (c,f) annual maximum intensity (nmol L<sup>-1</sup>) at surface (cyan), 100 m (darkblue) and 200 m (black) depth. In all panels, the simulated OAX characteristics are plotted against the yearly averaged atmospheric pCO<sub>2</sub> over the Northeast Pacific domain. Corresponding years are indicated at the top.

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On average across the entire Northeast Pacific, OAXs occupy an additional 6.3% of the upper 250 m depth, last 7.6 days longer, and are 0.18 nmol L<sup>-1</sup> ( $\approx$  -0.006 pH units) more intense for every additional 10  $\mu$ atm of CO<sub>2</sub> in the atmosphere. Near the surface, the increase in  $[H^+]$  extremes volume fraction linearly follows the atmospheric CO<sub>2</sub> rise in all regions (r<sup>2</sup> >0.96), with a slope in the open ocean regions that is twice as steep as that in the coastal regions, i.e., 1.3% versus 0.6%  $\mu$ atm<sup>-1</sup> (Figure 3a,d). The slope decreases substantially below 50 m in the coastal regions (Figure 3a) and below 100 m depth in the open ocean regions (Figure 3d). Between 50 and 100 m depth, the offshore volume fraction of extremes abruptly increases at about 355  $\mu$ atm, corresponding to the early step increase in Figure 2h,k.

250



255 the end of the simulations of around 10 days.





In the open ocean regions, the duration of the OAX are first of all much longer than in the coastal regions, and also increase faster (Figure 3e). At the surface, the rate of increase is three times larger than in the coastal regions (~1.70 days  $\mu$ atm<sup>-1</sup>), increasing the duration of an [H<sup>+</sup>] extreme from  $\sim$ 17 days in the first 15 years of the hindcast to more than 78 days in the last 15 years. At 100 m, the trend in the open ocean regions with atmospheric  $CO_2$  is very close to that at the surface, while the trend at 200 m is about half as steep.

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The annual maximum intensity of OAX also increases with increasing atmospheric  $CO_2$  throughout the Northeast Pacific, but in contrast to the other metrics, there are fewer differences between regions and between different depths (Figure 3c,f). In the coastal regions, the maximum intensity doubles at the surface between 1984-1998 and 2005-2019, increasing from values around 0.5 nmol  $L^{-1}$  to more than 1 nmol  $L^{-1}$ . This corresponds to an oceanic pH change of about -0.015. At 100 m depth and in the surface of open ocean regions, the intensities increase at nearly the same rate than simulated at the surface of coastal regions. At 200 m depth and at depth in the open ocean regions however, the increase is about 35% slower and the annual maximum intensities also remain lower (around 0.1 to 0.3 nmol  $L^{-1}$  in the 1980s, increasing to values between 0.5 and 1 nmol  $L^{-1}$  in the 2005-2019 period).

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By contrasting the results between the hindcast simulation with increasing atmospheric CO2 with the control simulation with detrended atmospheric  $CO_2$ , we can attribute the trends in the annual mean duration and annual maximum intensity to the rise in atmospheric CO<sub>2</sub>. This comparison shows that, as was the case for the volume of OAX, the increases in duration and maximum intensity are almost exclusively driven by the increase in atmospheric  $CO_2$  (not shown).

#### 3.3 Heterogeneous distribution of OAX intensities

The highly spatially aggregated data in Figure 3c,f hide the existence of substantial spatial differences in the distribution of the annual maximum intensities, especially at depth (Figure 4). While the annual maximum intensities and their changes with time 275 tend to be spatially relatively uniform at the surface, these intensities and changes are spatially very heterogeneous at depth. Particularly striking is the presence of a front at about 1500 km from the westcoast of the Americas, separating waters with very high maximum intensities of OAX to the east from waters with relatively low maximum intensities to the west. In fact, some of the highest maximum intensities are found just to the east of this front. As shown by Desmet et al. (2022), this pattern

- 280 of OAX intensities is the consequence of what they called "Large, Long, and Propagating" (LLP) OAX. These LLP OAX events originate near the coast of the Americas and then propagate for months and years westward. They harbor rather intense extremes as a consequence of encapsulating low pH and low  $\Omega_A$  waters during their formations near the coast, by isolating the extreme conditions within them owing to their rotation, and by partially enhancing these OAX conditions throughout their lifetime by enhanced export production and remineralization at depth, increasing [H<sup>+</sup>].
- 285 In our model simulations, these LLP OAXs dissipate at this intensity front, causing a very rapid drop-off of the maximum intensity to the west of it. This drop-off is located a few hundred kilometers closer to the shore at 100 m depth compared to the situation at 200 m depth. The presence of this front was the reason for separating the open ocean region into two sub-regions, i.e., the ONP and CNP (see section 2.4 and in Appendix A, whereby we used the average position of the front at 100 and 200 m to delineate these two regions). In the open ocean regions east of this front, i.e., in the ONP, the map reveals a highly patchy

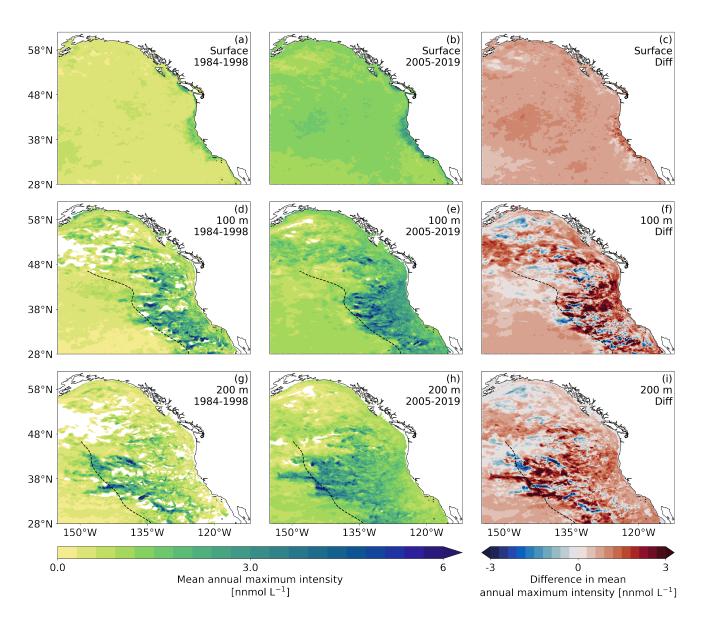




290 distribution of high maximum intensities, reflecting the pathways of the episodic high LLP events. Inside these LLP, the annual intensities can reach values of well above 5 nmol L<sup>-1</sup>. In contrast, the annual maximum intensities to the west of this front are generally less than 1 nmol L<sup>-1</sup>. The pattern of the increase of the maximum intensities follows the spatial distribution of average annual maximum intensity seen in both 15 years periods (contrast panels f and i with panels d,e and g,h, respectively in Figure 4), with increases in many places of up to 3 nmol L<sup>-1</sup>. This implies that the lines for the open ocean regions in Figure 295 3f represent an average of two sub-regions with distinctly different OAX intensities and changes thereof.







**Figure 4.** Maps of the average annual maximum intensity of  $[H^+]$  extremes for (left column) the period 1984-1998, (middle column) 2005-2019, and (right column) difference between the two periods. (a)-(c) Average conditions and difference for the surface layer. (d)-(f) As for (a)-(c) but for the a depth of 100 m, and (g)-(i), as for (a)-(c), but for a depth of 200 m. For the average, only years with extremes are taken into account. White areas depict areas that did not experience any extremes over the respective decade. The black dashed lines depict the front formed by the maximum extent of the westward propagating eddies at 100 and 200 m, respectively.





#### Change in return intensity 3.4

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The rapid increase in intensity of  $[H^+]$  extremes causes between the first and last 15 years of the hindcast a substantial increase in the [H<sup>+</sup>] intensity associated with a given return period (Figure 5). Intensity levels that were rare to unlikely from 1984 to 1998 have become frequent in the last 15 years. For instance, an intensity of 1 nmol  $L^{-1}$  (~-0.020 pH unit) was rare at 100 m depth in the CCS (one in 13.3 years event) but occurs every second year in the last 15 years (one in 1.7 years event; Figure 5b). Similarly, at 100 m depth in the CNP, such an intensity occurs once in a hundred years based on the data of the first 15 years. 20 years later between 2005 and 2019, such an event is estimated to occur every second year (one in 2.2 years event; Figure 5e). Changes in the return period of high intensities are also large. An intensity of 4 nmol  $L^{-1}$  (~-0.084 pH unit) would not occur in a hundred years at 100 m depth based on the data of the first 15 years while it represents a one in 19.2 (27.1) years 305 event in the CCS (ONP) in the last 15 years (Figure 5b,e).

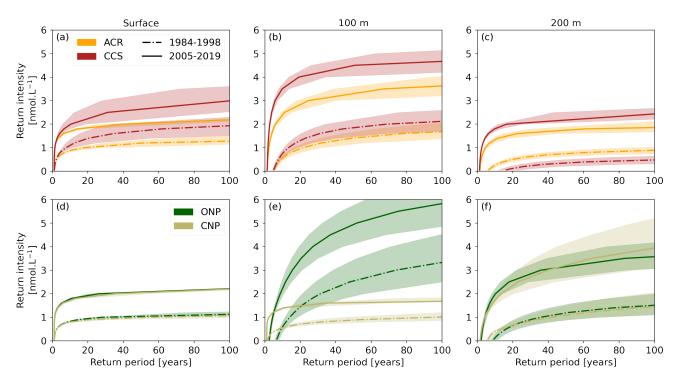


Figure 5. Return intensity (in nmol  $L^{-1}$ ) as a function of the return period (in years) for the HCast scenario at the (a) surface, (b) 100 m, and (c) 200 m depth in the (top) ACR and CCS, and (bottom) ONP and CNP regions, for two different time periods, respectively 1984-1998 (dashdot) and 2005-2019 (solid). The line represents the median and the shading the 40<sup>th</sup>-60<sup>th</sup> percentile interval based on the spatial variability within each region.

As the other metrics, the return intensities as well as the magnitude of their change vary spatially and with depth. At the surface, the changes in the return intensity tend to be smaller than in the subsurface, and similar between regions, as they are for the intensity itself (Figure 4c and 5a,d). The largest changes in return intensity occur at 100 m depth, in particular in





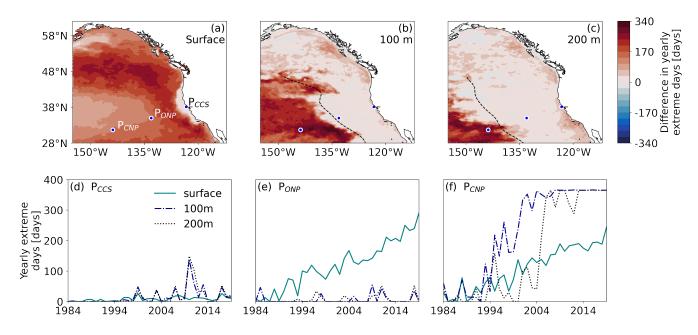
- 310 inshore areas and in the ONP region where the one in ten years return intensity increases by 2.07 nmol L<sup>-1</sup> ( $\sim$ -0.048 pH unit) on average (from 0.63 to 2.71 nmol L<sup>-1</sup>; Figure 5b,e). Finally, some regions exhibit substantial spatial variability in the return periods associated to given return intensity (Figure 5). The largest spatial variability is found at 100 m depth in the ONP region, matching the strong variance of OAX maximum intensity in this region (Figure 4d,e and 5e).
- Overall, the rate of change of OAXs and their characteristics in response to the increase in atmospheric  $CO_2$  varies in space and depth. While the surface response is rather linear in time and homogeneous in space, the subsurface response is more variable and depends on the marine environment being an inshore/offshore regime or an intermediate offshore regime with substantial coastal imprint from mesoscale eddies.

# 3.5 Rapid vs. delayed emergence of near-permanent OAX

While the volume of OAX already revealed some substantial non-linear response to the rise in atmospheric CO<sub>2</sub> with abrupt onsets and rapid expansions (Figure 2), the last metric of interest, i.e., the number of extreme days per year, shows the most striking pattern of abruptness (Figure 6). The increase in yearly extreme days between the first and last 15 years of the hindcast shows sharp spatial transitions at all depths, but distributed heterogeneously in space, with large differences in the magnitude of the increase. The increases in the number of extremes days reach up to more than 200 days, leading to near permanent OAX conditions.







**Figure 6.** Spatiotemporal progression of the yearly  $[H^+]$  extreme days in the Northeast Pacific. (a) Map of the difference in yearly  $[H^+]$  extreme days between 2005-2019 and 1984-1998 in the HCast simulation at the surface; (b) as (a), but for 100 m depth; (c) as (a) but for 200 m depth. The three blue disks with white contours in each map denote the locations for the time series in panels (d) - (f), reflecting a location in the nearshore CCS (d), a location in the ONP region (e), and in the CNP region (f). The black dashed lines in (b) and (c) denote the location of the westward eddy propagation front.

The strongest step increases in the yearly number of extreme days occur in the subsurface of the CNP. In only two years (between 2004 and 2006), the yearly number of extreme days at 200 m at point  $P_{CNP}$  jumps from ~30 to more than 300 days (Figure 6f). Similarly, at 100 m depth, the yearly number of extreme days jumps from ~30 to 150 days in one year (1994-1995) and to more than 300 days 6 years later (2001). These local step responses are also seen in the volume fraction of the subsurface (50-100 m) of the CNP (Figure 2k), although the step response tends to be masked by the aggregation that occurs when the volume fraction is computed. In contrast, no such step response occur during our analysis period in the subsurface central CCS and ~1000 km offshore ( $P_{CCS}$  and  $P_{ONP}$ ), where only a small increase in yearly extreme days is seen (Figure 6). OAXs remain episodic even towards the end of the hindcast under elevated atmospheric CO<sub>2</sub> levels (Figure 6a). Overall, the area experiencing large increases and reaching near-permanent extreme state towards the end of the hindcast, shrinks with depth.

At the subsurface (100 m and 200 m depth), the sharp spatial transition in the response coincides with the front in annual maximum intensity and its change (Figure 4d-i) described in section 3.1 as well as with the westward extent of eddy-driven OAXs, i.e., the eddy-propagation front (black dashed lines in Figures 4 and 6).

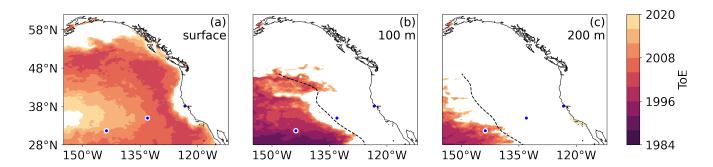
The spatial pattern of the large vs. small increase in yearly extreme days is well reflected in the spatial distribution of the 340 Time of Emergence (ToE), defined as the year when the "yearly mean  $[H^+]$ " (long-term linear trend in  $[H^+]$ ) exceeds the





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threshold (Figure 7). The area experiencing this emergence during our analysis period decreases with depth. At the surface, the yearly mean [H<sup>+</sup>] exceeds the threshold in 88% of the Northeast Pacific over the 36 years period (Figure 7a). Only the CCS and ACR have a stronger surface [H<sup>+</sup>] variability than surface [H<sup>+</sup>] trend under increasing atmospheric CO<sub>2</sub>. In the subsurface, the yearly mean [H<sup>+</sup>] only exceeds the threshold in 40% and 15% of the Northeast Pacific at 100 m and 200 m depth respectively (Figure 7b,c). Both at 100 and 200 m depth, the emergence is confined to the offshore regions that do not have an imprint from coastal variability, i.e., in the CNP west of the eddy front. At P<sub>CNP</sub>, the emergence occurs as early as 1996 at 100 m depth, matching the early step response in yearly extreme days seen at that location (Figure 6f).



**Figure 7.** Maps of the Time of Emergence (ToE) of the yearly mean  $[H^+]$  (long-term trend in  $[H^+]$ ) above the local  $[H^+]$  threshold at (a) the surface, (b) 100 m depth, and (c) 200 m depth in the HCast simulation. White areas denote regions where the long-term trend does not exceed the threshold at the end of 2019. The three blue disks with white contours in each map denote the locations where the time series in Figures 1 and Figure 6 were extracted. The black dashed lines denote the westward eddy propagation fronts.

# 4 Discussion

# 4.1 OAX increase in response to the rise in atmospheric CO<sub>2</sub>

- The increasing rates of the yearly number of extreme days, duration, and intensity of OAX with respect to increasing atmospheric pCO<sub>2</sub> found in our study are in the same order of magnitude than the ones estimated in previous OAX studies in the global ocean over the historical period 1861-2005 (Burger et al., 2020; Gruber et al., 2021). The similarity in the rates of increase despite the very different time frames of the two compared periods (145 years vs. 36 years) underlines the key role of atmospheric pCO<sub>2</sub> in OAX increase over time. The surface/depth gradient in the rate of increase however differs for the number of attrame days and OAX duration. While the increasing rates of the number of days and OAX duration at 200 m nearly equal
- of extreme days and OAX duration. While the increasing rates of the number of days and OAX duration at 200 m nearly equal their surface rates (weaker by only 11-15%), we found increasing rates ~4 times weaker at 200 m compared to the surface. Therefore, while the rate of increase in number of days is similar at the surface in both studies (3.7 days. $\mu$  atm<sup>-1</sup> in our study and 10% larger for the global ocean in their study), we found a fourfold smaller rate at 200 m than in Burger et al. (2020). A similar pattern is also found for OAXs duration. The slower depth increase in number of days and duration with respect to





360 increasing atmospheric  $pCO_2$  in our study is likely arising from the additional large variability induced by mesoscale eddies at depth in our high-resolution simulations, that may not be captured in global Earth system models.

Emphasizing the rapidity of the changes in OAX is the drastic reduction in the return period of high intensities between the 1984-1998 and 2005-2019 periods. In less than 40 years, extremely rare (>>100 years) high intensities become a one in less than 30 years event. Similarly, a strong reduction in the return periods of intense marine heatwaves is projected under

- 365 global warming (Laufkötter et al., 2020). The rapidity of the change is further corroborated by the near-permanency of OAXs that is reached in a large fraction of the upper 250 m of the Northeast Pacific within the 36 years period of our hindcast. The near-permanency of extreme conditions has also been projected to occur between 2030 and 2050 for aragonite undersaturation events (absolute threshold) at the seafloor of the 10 km coastal CCS (Hauri et al., 2013a). From a mean duration of 16 days in 2010, those events are projected to reach near-permanency in less than 40 years (Hauri et al., 2013a). In our study however,
- 370 OAXs, defined based on a relative threshold, do not reach near-permanency in the CCS given the strong natural variability of the region. This highlights the very different perspectives of using absolute versus relative thresholds to define extreme events.

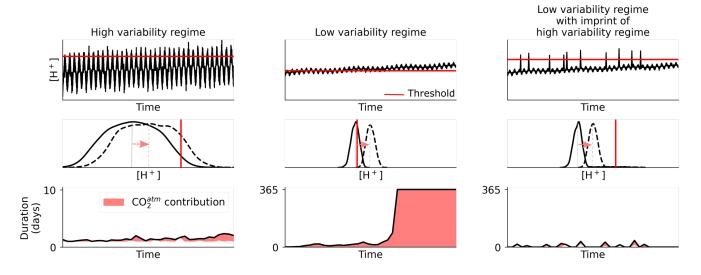
## 4.2 Spatial heterogeneity in OAX increase

Although rapid, changes in OAX are spatially heterogeneous in the Northeast Pacific. While OA trends are of similar magnitude between the studied regions and depths, differences in types and magnitudes of the marine environment's natural variability
lead to varying increase in OAX (Figure 8). The relatively slow and progressive increase in OAX in the nearshore central CCS can be explained by the strong natural variability of the region. The amplitude of surface [H<sup>+</sup>] variability is about six times larger than the magnitude of the OA trends from 1984 to 2019 (Appendix Figure B4). The same variability versus trend pattern and subsequent OAX response holds for the subsurface. In contrast, ~1000 km further offshore and in the CNP region, the amplitude of surface [H<sup>+</sup>] variability is closer to the magnitude of OA trends (ratio of 1.14 at P<sub>ONP</sub> and 1.17 at P<sub>CNP</sub>) leading to the strong and rapid increase in OAX. The more similar amplitudes of variability and trends in these regions is due to a five times smaller surface variability compared to the nearshore CCS (Appendix Figure B4). Consistent with the even larger and

- faster increase in OAX found at depth in those regions is the even lower variability over trend ratios in the subsurface CNP (Figures B4, 6c, f and 7). In the subsurface waters off central CCS (ONP region) however, we found a much weaker increase in OAX. While the amplitude of the variability within the interdecile range is small and comparable to the one of the subsurface
- 385 CNP, high [H<sup>+</sup>] are episodically reached (Appendix Figure B4). These short and episodic high [H<sup>+</sup>] signals have an amplitude above the upper bound of the interdecile range 7.9 (3) times larger than the amplitude of the interdecile range itself at 100 m (200 m) depth, leading to a highly right skewed natural variability distribution (Appendix Figure B4). This skewness delays the emergence of OA trend over the threshold, which explains the weaker increase in OAX (e.g., Figure 8).
- In addition to the spatial heterogeneity in the magnitude of OAX increase, the abruptness of the change also varies spatially, 390 with the most non-linear increases in OAX occurring in the subsurface CNP. In light of the relative threshold used in this study, such non-linearities imply that marine organisms may suddenly experience much more often conditions at the edge or outside the local environmental conditions to which they tend to be adapted to, with potential deleterious effects on their fitness (Vargas et al., 2017, 2022; Kroeker et al., 2020; Rivest et al., 2017; Cornwall et al., 2020). While the large increase in







**Figure 8.** Schematic of three different  $[H^+]$  variability regimes that lead to three different responses with regard to OAX under the same long-term increase in  $[H^+]$  from the rise in atmospheric CO<sub>2</sub>. (Top) Illustrative 36 years daily time series and their respective 99<sup>th</sup> percentile threshold computed on the linearly detrended time series. (Middle) Associated probability density functions of the first (solid lines) and last (dashed lines) decades with the same threshold as above (red). (Bottom) Associated annual mean event duration (in days). The red filled area depicts the difference in annual mean event duration between the time series with and without the long-term trend, i.e, illustrating the contribution of atmospheric CO<sub>2</sub> rise to the temporal change in annual mean event duration. Note the different scale in the left plot. A low frequency modulation, representing decadal climate variability, is included in all three signals.

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OAX in low variability regions, such as the subsurface CNP, results from the rapid exceedance of the variability by OA trends, the non-linearities (step increases) may result from the concurrent effect of OA trends and synergistic low frequency climate variability, as illustrated in Figure 8. Indeed, low frequency (decadal to multi-decadal) climate variability is likely to modulate, i.e., mitigate or amplify in turn, the imprint of OA trends on OAX. In low natural variability regions, the interaction between OA trends and climate variability may be the cause of a sudden wide-spread crossing of the threshold, when both act in the same direction at the time when the mean state approaches the threshold (Figure 8).

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Differences in the natural variability of the marine environment are also reflected in the regionally different ToEs. We find shorter ToE in the surface subtropical oligotrophic gyre (~16 years), longer ToE in the surface offshore subarctic region (~25 years), and even longer ToE in surface coastal areas, both along the Alaskan and the U.S. West coast (~30-32 years to no emergence yet in 2019). The ordering of these results is consistent with results from observations with the station ALOHA in the subtropical oligotrophic gyre having the shortest ToE in the Northeast Pacific (9 years), closely followed by station Papa in

405 the offshore subarctic (10 years), and then by coastal sites (12-23 years) (Sutton et al., 2019). The ToEs found in our study are about 1.5 to 2.5 times larger than those found in Sutton et al. (2019). This is also true when comparing to pCO<sub>2</sub> and pH ToE found in Keller et al. (2014). However, these differences are consistent with the differences in definitions, with our detection





threshold being more restrictive than in Keller et al. (2014), and with the absence of seasonal variability in the background monthly variability used by Sutton et al. (2019), as well as the absence of intra-annual variability in Keller et al. (2014).

- 410
- As pointed out with regard to the emergence of OA trends in Sutton et al. (2019), our study underlines the importance of the natural variability of the marine environment with respect to the response of OAX to anthropogenic changes. Our results based on a high spatiotemporal resolution model show that the emergence of near-permanent OAXs is substantially delayed in coastal regions, as well as quite far offshore at depth in regions that see the mesoscale imprint of nearshore conditions.

## 4.3 Delayed emergence of near-permanent subsurface OAX by mesoscale cyclonic eddies

- 415 In the subsurface of the ONP region, the shape of OAX (Figure 1a) and the spatial pattern of annual maximum intensity (Figure 4d-i) relate to mesoscale eddy tracks. This is consistent with previous findings based on a Lagrangian perspective that found mesoscale cyclonic eddies to be important drivers of OAX in the subsurface of the Northeast Pacific (Desmet et al., 2022). The sharp spatial boundaries between short (~22 years on average) and long (~32 years on average) ToE in the subsurface, and the corresponding boundaries between large (+249 days on average) and small (+28 days on average) increases in yearly extreme
- 420 days and annual mean event duration from 1984 to 2019, correspond well to the westward extent of cyclonic eddy-driven OAXs in the Northeast Pacific (Desmet et al., 2022). This result suggests that mesoscale cyclonic eddies substantially enhance the amplitude of the background variability at depth in the open ocean, and, as a result, lead to large threshold values relative to the mean of local [H<sup>+</sup>] distributions (Appendix Figures B4 and A1). This eddy-induced variability substantially delays the ToE of OAX and reduces the increase in yearly extreme days and event duration in comparison to open ocean regions experiencing
- 425 weak mesoscale activity. This is consistent with our subsurface rates of increase in the number of extreme days and OAX duration being lower than in previous global ocean studies that are based on global Earth system models that do not fully resolve mesoscale variability (Section 4.1).

The cyclonic eddy-driven OAX westward propagation front defined in our study resonates well with previous findings on the offshore imprint of nearshore waters from cyclonic eddies (Zhao et al., 2021; Chabert et al., 2021; Amos et al., 2019;

- 430 Chenillat et al., 2016; Nagai et al., 2015). They show that cyclonic eddies maintain locally elevated nutrients concentrations, productivity, and organic matter in the offshore more than 1000 km away from the CCS coast. Especially, subsurface coherent eddies originating from the eastern boundary poleward undercurrents ("Puddies") have been shown to contribute to low-oxygen extreme events and to reach thousands of kilometers offshore in the subsurface (Frenger et al., 2018). These Puddies have their core between 100 and 700 m depth, matching the absence of eddy front signal in surface OAX and its presence at 100 and 200
- 435 depth. Furthermore, the depth-dependency of our eddy front is consistent with Puddies sliding along isopycnals and subducting from the nearshore formation regions into the gyre interiors (Frenger et al., 2018). Finally, the presence of such eddy front is consistent with mesoscale eddies decaying after a certain distance from the coast (Frenger et al., 2018; Chenillat et al., 2016). However, the exact location of this front may be altered by the non-uniform spatial resolution of the telescopic grid, potentially accelerating the decay of mesoscale eddies in our model as the resolution coarsens.





## 440 4.4 Limitations and caveats

As the science of ocean acidity extreme events is only in its early stage, there is no consensus yet on the definition of OAX. In this study we use a common Eulerian event-based framework on a single carbonate variable criterion. Several other definitions have been used in previous works, such as in Desmet et al. (2022) where a Lagrangian approach in three dimensions on a dual variable criterion (pH- $\Omega_A$ ) was taken to define extremes. We expect the Lagrangian pH- $\Omega_A$  extreme events to have similar temporal responses to the increase in atmospheric  $pCO_2$  as the ones found in this study. Yet, a few differences might ensue 445 from the dual variable criterion and the Lagrangian framework. The former may lead to a different temporal response of OAX in the surface of the ONP and CNP regions, with an abrupt increase in contrast with the linear increase found in our study. Indeed, in these surface offshore areas, where pH and  $\Omega_A$  are seasonally out of phase, pH- $\Omega_A$  extremes will likely occur only once both variables start to be below the lower bound of their variability in the reference period regardless of the season 450 (Xue et al., 2021; Kwiatkowski and Orr, 2018; Desmet et al., 2022). As regards the Lagrangian framework, since we find near permanent extreme conditions in a large fraction of the upper 250 m of the Northeast Pacific, one can expect a single large Lagrangian OAX to form towards the end of the analysis period, with a mean volume close to the entire volume of the upper 250 m of the Northeast Pacific. This may limit the relevance of the Lagrangian definition of OAX when using fixed baselines on reference periods with past atmospheric  $pCO_2$  levels such as preindustrial levels or even levels of a few decades earlier, as

455 in this study, due to the rapid OA trend.

An alternative to fixed baselines is the use of shifting baseline periods that accounts for changes in the mean state of the marine carbonate system variable of interest over the period for which extremes are analyzed (Burger et al., 2020). In that case, the threshold varies in time, following OA trends. Changes in OAX defined on shifting baselines are therefore not well captured by the ToE concept. What drives their change is rather a modification of the short-term variability, i.e., in the nature of

- the underlying distribution, of the marine carbonate system variable of interest. This leads to larger disparities in the changes in OAX defined with respect to different carbonate variables than when using fixed baselines (Burger et al., 2020). At the global scale,  $[H^+]$  extremes defined on shifting baselines exhibit large increases in their volume, duration, and intensity in the upper 200 m depth, whereas  $\Omega_A$  extremes follow a rather decreasing pathway. In our study, a change from fixed to shifting baseline would result in a slower progression of  $[H^+]$  extremes over the course of the analysis period. Still, spatially heterogeneous
- 465 increases in OAX are expected to be found, given the expected different changes in the short-term variability of the carbonate variables between regions and depths, stemming from the many processes in play e.g., long-term changes in upwelling, eddy activity, buffer factor, or temperature and their varying relationship with the different carbonate variables. The ecological relevance of using a fixed vs. shifting baseline to define OAX depends on the level of adaptive capacity of marine ecosystems to long-term changes in OA, and on the time scales of this potential adaptation (Oliver, 2019; Oliver et al., 2021; Gruber et al.,
- 470 2021). Yet the level of adaptive capacity of marine ecosystems to long-term changes in OA is still unclear (Mekkes et al., 2021; Bednaršek et al., 2016, 2017, 2021; Manno et al., 2017). The use of a fixed baseline, as chosen in our study, allows for capturing changes in OAX ensued from both long-term anthropogenic and short-term variability changes, that add up and may together lead to episodic crossings of biological thresholds (Doney et al., 2020; Bednaršek et al., 2017).





In addition to the detection of extremes with regard to  $[H^+]$ , we quantify the proportion of  $[H^+]$  extremes that are undersaturated with regard to aragonite, since  $\Omega_A = 1$  is a well-known threshold for OA impacts on shelled marine organisms such 475 as pteropods (Bednaršek et al., 2014). However, different thresholds may be relevant for different organisms, life stages, and durations of exposure (Bednaršek et al., 2019; Fabry et al., 2008). For instance, supersaturated waters with  $\Omega_A$  below 1.5 have also been found to cause mild and severe dissolution of pteropods shell (Bednaršek et al., 2019). When quantifying the proportion of OAXs that are in waters with an  $\Omega_A$  below 1.5, cross-shore and cross-depth patterns similar to those found for a 480 threshold of  $\Omega_A = 1$  (section 3.1) were found (Appendix Table B1).

As for the undersaturation criterion, most of the surface OAXs and most of the CNP OAXs have  $\Omega_A$  above 1.5. However, in the CNP 50-100 m depth layers, 1% of OAX volume have  $\Omega_A$  levels below 1.5 while none is undersaturated yet (Appendix Table B1 and Table 2). The analysis for  $\Omega_A < 1.5$  also reveals that most of the newly undersaturated OAXs found in the 50-100 m depth layer of ACR and CCS occur in waters that were only weakly supersaturated ( $\Omega_A < 1.5$ ) in the CCons simulation

(Table 2 and Appendix Table B1). This result is consistent with previous findings on low aragonite saturation state events (i.e., 485 extremes defined based on absolute thresholds), that show a projected rapid increase in the duration of undersaturation events at the seafloor of the nearshore CCS, already weakly supersaturated with regard to aragonite in the preindustrial period ( $\Omega_A$ permanently under 1.4; Hauri et al., 2013a). It suggests that organisms hit by newly undersaturated OAXs may already be, in most of the cases, adapted to near-corrosive conditions.

#### 5 Conclusions 490

Our study highlights the rapidity of the increase in ocean acidity extremes, in agreement with previous regional and global scale studies on past and projected changes (Hauri et al., 2013a; Burger et al., 2020; Gruber et al., 2021). What was defined as rare high acidity events in the past, i.e., relative to atmospheric CO<sub>2</sub> concentrations of 1979 in our study, has already become a near-permanent state over large areas in the upper 250 m of the Northeast Pacific, although with important regional variations. Knowledge of the impacts of present-day extremes on organisms and ecosystems may therefore offer a glimpse of the future

495

health of the ocean, respectively near future in the surface and the offshore, and more distant future in coastal subsurface regions given the spatial heterogeneity in increasing rates of acidity extremes.

The increase in ocean acidity extremes from 1984 to 2019 in the Northeast Pacific is mostly driven by the rise of anthropogenic atmospheric CO<sub>2</sub>. Present-day trends in ocean acidity extremes will therefore continue as atmospheric CO<sub>2</sub> continues to rise, or even accelerate as the buffer capacity of the seawater declines, especially in regions with already low buffering 500 capacity, such as the Alaskan coast and the nearshore California current system (Cai et al., 2020; Feely et al., 2018; Jiang et al., 2019). This is worrisome in the context of the constantly growing anthropogenic CO<sub>2</sub> emissions (Friedlingstein et al., 2019), especially as a large fraction of these high acidity extremes also cross well-known biological thresholds of aragonite saturation state. Furthermore, non-linearities in the increase of extremes defined on relative thresholds, such as those found in

our study, imply that organisms may suddenly experience much more often conditions at the edge or outside the variability 505



510



range of their local environment. This may lead to deleterious impacts on marine organisms since they tend to be adapted to their local environment and its variability (Vargas et al., 2017; Kroeker et al., 2020; Rivest et al., 2017; Cornwall et al., 2020). While the strong ocean acidification trend overtakes the natural variability over large areas in the upper 250 m of the Northeast Pacific, interannual variability still drives the occurrence of acidity extremes in subsurface coastal regions substantially. In the California current system, the El-Niño-Southern-Oscillation is likely to be a strong modulator of ocean acidity extremes on interannaual timescales, since it modulates the biogeochemistry of the region (Turi et al., 2018; Frischknecht et al., 2015). Studies that assess the response of acidity extremes in coastal regions of the Northeast Pacific. Besides interannual variability, our study uncovers the key role of mesoscale activity in slowing down the increase in acidity extremes in the subsurface of

515 intermediate offshore regions compared to previously found increases in global scale studies (e.g., Burger et al., 2020). This implies that ocean acidity extremes in those regions may increase less rapidly than projected by Earth system models (Burger et al., 2020), since these models often miss the strong variability induced by mesoscale activity.

*Data availability.* The processed data are available online at the ETH library archive (https://www.research-collection.ethz.ch/handle/20. 500.11850/604737). Model output data may be obtained upon request from the corresponding author (flora.desmet@usys.ethz.ch).

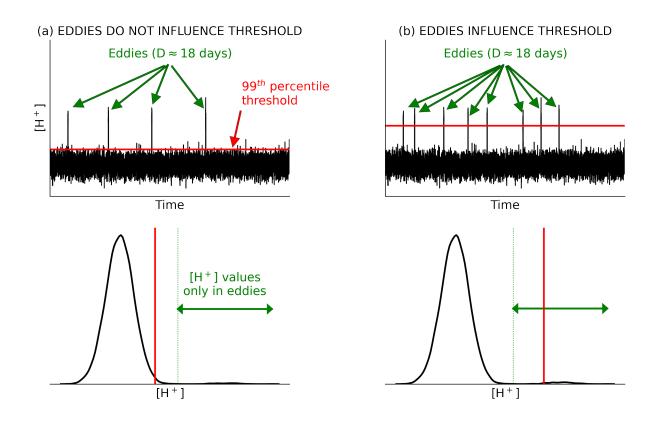
## 520 Appendix A: Eddy front definition

We identify the westward eddy propagating front at 100 m and 200 m depth between 28°N and 47°N as the farthest distance to the coast where at least one eddy-driven OAX (Desmet et al., 2022) passes every five years. The rationale for this choice is the following. In offshore regions with small variability range, eddies need to be present more than 1% of the time to significantly affect the threshold defined as the 99<sup>th</sup> of all aggregated daily value at a given location, i.e., more than 132 days in our case

- from 1984 through 2019 (Figure A1). Eddy-driven OAXs, as found in previous work by Desmet et al. (2022), have an average local duration of 18 days both at 100 m and 200 m depth, meaning that they stay on average 18 days at a given location. Thus, a location must see on average seven of these eddy-driven events over the entire period for its threshold to be substantially moved away from the mean variability range (Figure A1), i.e., at least one eddy-driven OAX every five years. For each LLP events of Desmet et al. (2022) we first compute its maximum distance to the coast and the associated latitude. We then bin
- 530 these events based on the latitude at which they are the farthest away from the coast into 1°latitudinal bands between 28°N and 47°N. Within each latitudinal bin we select the seventh maximum distance to the coast to make sure that at least seven eddy-driven OAXs reach this distance from the coast. In a last step we apply a Gaussian smoothing ( $\sigma = 2$ ) to the eddy front.





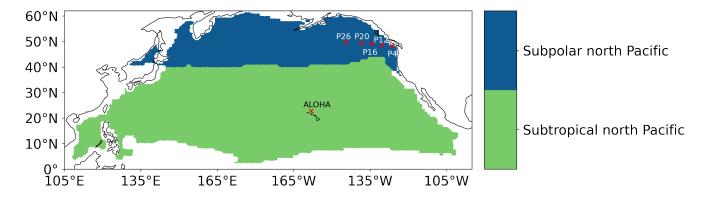


**Figure A1.** Schematic of  $[H^+]$  daily variability in (a) a region where the threshold is not influenced by passing mesoscale eddies and (b) a region where the threshold is shifted away from the normal distribution due a high number of passing eddies. In (a), the high  $[H^+]$  signal carried eddies accounts for less than 1% of the total days ( $\approx$ 4x18 days  $\approx$ 72 days while 1% of the days from 1984 to 2019 would be 132 days) and therefore does not influence the threshold that remains below the high  $[H^+]$  values carried by eddies. In (b), the high  $[H^+]$  signal of eddies accounts for more than 1% of the total days ( $\approx$ 8x18 days  $\approx$ 144 days) and therefore raises the threshold to a value within the range of high  $[H^+]$  values carried by eddies.

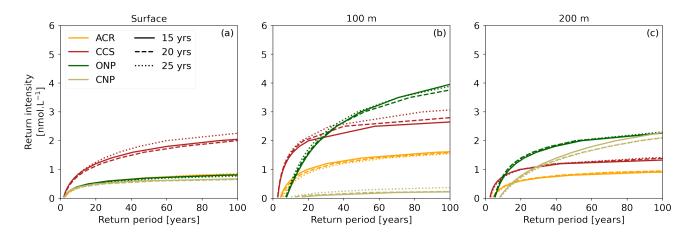




# **Appendix B: Supplementary figures**



**Figure B1.** Biomes and stations used to evaluate ROMS-BEC surface pH and  $\Omega_A$  long-term trends against observations from Lauvset et al. (2015); Franco et al. (2021); Bates et al. (2014) in Table 1.



**Figure B2.** Return intensity (in nmol  $L^{-1}$ ) as a function of the return period (in years) at the (a) surface, (b) 100 m, and (c) 200 m depth in the ACR, CCS, ONP, and CNP regions and for time periods of length 15 years (solid; 2005-2019), 20 years (dashed; 2000-2019), and 25 years (dotted; 1995-2019) in the CCons simulation. The line represents the median based on the spatial variability within each region.





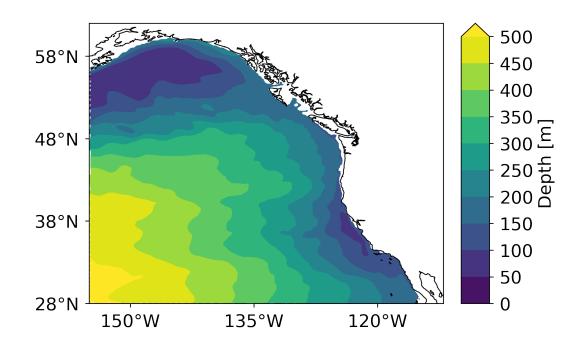
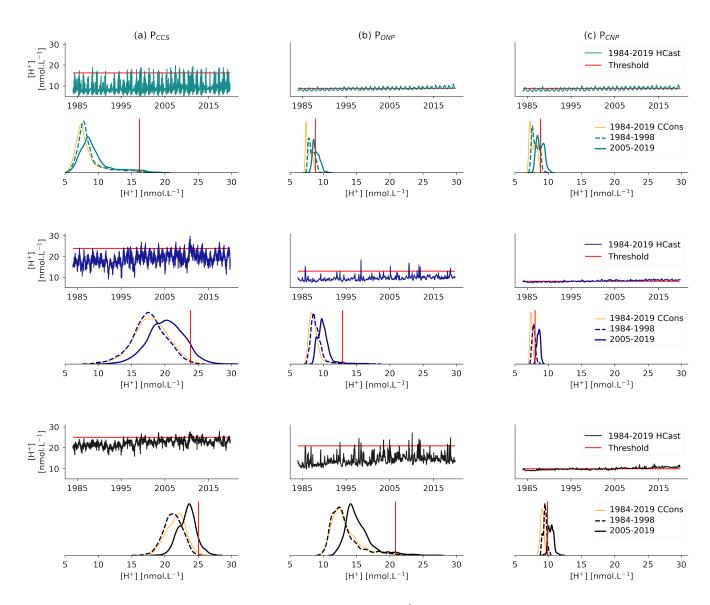


Figure B3. ROMS-BEC simulated climatological (1984-2019) annual mean depths of the  $\Omega_A$  saturation horizon ( $\Omega_A$ =1) in the CCons simulation.







**Figure B4.** Time series and probability density functions (PDF) of  $[H^+]$  (nmol  $L^{-1}$ ) at the three locations plotted in Figure 6 for (top) surface, (middle) 100 m depth and (bottom) 200 m depth in the HCast simulation. The respective  $[H^+]$  thresholds are plotted in red. In the PDF plots, the PDF over the entire period (1984-2019) in the CCons simulation is plotted in orange and the PDFs of the 1984-1998 and 2005-2019 periods of the HCast simulation are plotted in cyan, blue, and black depending on the depth with a dashed and solid line respectively. The periods correspond to the periods used for the difference maps in Figures 4 and 6.





**Table B1.** Fraction (in %) of the OAX volume that is characterized by  $\Omega_A < 1.5$  conditions with regard to aragonite averaged over 1984-2019 for the four different regions of the Northeast Pacific shown in Figure 1 and for three different depth layers. Numbers in the " $\Omega_A$  newly < 1.5" column give the fraction of the OAX volume that is newly in  $\Omega_A < 1.5$  conditions with regard to aragonite. This is computed by identifying the fraction of the OAX volume that is in  $\Omega_A < 1.5$  conditions in the HCast simulation but in  $\Omega_A \ge 1.5$  conditions in the CCons simulation where atmospheric CO<sub>2</sub> was kept at its 1979's value.

	0-50 m		50-100 m		100-250 m	
	$\Omega_A$ newly < 1.5	$\Omega_A < 1.5$	$\Omega_A \text{ newly} < 1.5$	$\Omega_A < 1.5$	$\Omega_A$ newly < 1.5	$\Omega_A < 1.5$
Alaskan Coastal Region (ACR)	12	23	1	99	≪1	100
California Current System (CCS)	<1	7	1	99	0	100
Offshore Northeast Pacific (ONP)	2	2	6	17	8	95
Central Northeast Pacific (CNP)	≪1	≪1	1	1	4	10

*Author contributions.* The conceptualisation of this research was done by all co-authors. FD performed the simulations and conducted the formal analysis. FD prepared the manuscript with contributions from all co-authors.

Competing interests. The authors declare that they have no conflict of interest.

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540 Zürich, Euler, which is located in the Swiss Supercomputing Center (CSCS) in Lugano and operated by ETH ITS Scientific IT Services in Zürich. All further analyses and all figures were created using the software package Python. We thank Dr. Meike Vogt for her valuable feedback on an earlier version of the manuscript.





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