



### Chemical Exposure Due to Anthropogenic Ocean Acidification Increases Risks for Estuarine Calcifiers in the Salish Sea: Biogeochemical Model Scenarios

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Bednaršek N, Pelletier G, Ahmed A and Feely RA (2020) Chemical Exposure Due to Anthropogenic Ocean Acidification Increases Risks for Estuarine Calcifiers in the Salish Sea: Biogeochemical Model Scenarios. Front. Mar. Sci. 7:580. doi: 10.3389/fmars.2020.00580 Ocean acidification (OA) is projected to have profound impacts on marine ecosystems and resources, especially in estuarine habitats. Here, we describe biological risks under current levels of exposure to anthropogenic OA in the Salish Sea, an estuarine system that already experiences inherently low pH and aragonite saturation state  $(\Omega_{ar})$ conditions. We used the Pacific Northwest National Laboratory and Washington State Department of Ecology Salish Sea biogeochemical model (SSM) informed by a selection of OA-related biological thresholds of ecologically and economically important calcifiers, pteropods, and Dungeness crabs. The SSM was implemented to assess current exposure and associated risk due to reduced  $\Omega_{ar}$  and pH conditions with respect to the magnitude, duration, and severity of exposure below the biological thresholds in the Salish Sea in comparison to the pre-industrial era. We further investigated the individual effects of atmospheric CO<sub>2</sub> uptake and nutrient-driven eutrophication on changes in chemical exposure since pre-industrial times. Our model predicts average decreases in  $\Omega_{ar}$  and pH since pre-industrial times of about 0.11 and 0.06, respectively, in the top 100 m of the water column of the Salish Sea. These decreases predispose pelagic calcifiers to increased duration, intensity, and severity of exposure. For pteropods, present-day exposure is below the thresholds related to sublethal effects across the entire Salish Sea basin, while mortality threshold exposure occurs on a spatially limited basis. The greatest risk for larval Dungeness crabs is associated with spatially limited exposures to low calcite saturation state in the South Sound in the springtime, triggering an increase in internal dissolution. The main anthropogenic driver behind the predicted impacts is atmospheric CO2 uptake, while nutrient-driven eutrophication plays only a marginal role over spatially and temporally limited scales. Reduction of CO<sub>2</sub> emissions can help sustain biological species vital for ecosystem functions and society.

Keywords: ocean acidification, threshold, attribution analyses, anthropogenic stressors, nutrient remineralization, Dungeness crab, pteropods, biogeochemical projections

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### INTRODUCTION

Anthropogenically enhanced ocean acidification (OA) represents one of the most significant risks to coastal marine ecosystems (Feely et al., 2010, 2016, 2018; Bednaršek et al., 2016, 2014, 2017a, 2018, 2019, 2020; Wallace et al., 2014; O'Neill et al., 2017; Evans et al., 2019). These concerns are especially relevant in highly productive eastern boundary upwelling systems, as well as the coastal and estuarine systems where OA impacts on key marine organisms are already detectable. These organisms face a high risk of impacts well before 2100, even under the low-emissions scenario (RCP2.6; Gattuso et al., 2015), that will negatively affect human benefits and services. The identification of major drivers and trends of OA variability is critical for understanding the biological changes related to OA.

The upwelling regime along the United States West Coast has experienced a pH decline of at least 0.1 pH unit since pre-industrial times (Chavez et al., 2017; Laruelle et al., 2018; Osborne et al., 2020). The results of intensifying OA have resulted in increased magnitude, duration, and frequency of OA exposure (Feely et al., 2008, 2016, 2018; Gruber et al., 2012; Hauri et al., 2013; Turi et al., 2016; Chan et al., 2017; Sutton et al., 2019). Experimental simulations of OA exposure demonstrate copious evidence of the detrimental effects of OA on a variety of ecologically and economically important calcifiers along the United States West Coast (Gaylord et al., 2011; Baumann et al., 2012; Lischka and Riebesell, 2012; Waldbusser et al., 2015; McLaskey et al., 2016; Miller et al., 2016; Osborne et al., 2016; Giltz and Taylor, 2017; Hales et al., 2017; Kapsenberg et al., 2018; Williams et al., 2019). Furthermore, synthesis and metaanalyses work indicate a much broader vulnerability with the ultimate impact on marine ecosystems (Kroeker et al., 2013; Busch and McElhany, 2016). Moreover, the impact is noticeable under present-day conditions, with field studies delineating effects in some of the most vulnerable marine species, such as oysters (Barton et al., 2012, 2015), copepods (Engström-Öst et al., 2019), foraminifera (Osborne et al., 2016, 2020), pteropods (Bednaršek et al., 2014, 2016, 2017a, 2018, 2019; Feely et al., 2016) and Dungeness crab larvae (Bednaršek et al., 2020). For the last three species in particular, robust attribution analyses have unequivocally demonstrated the impact of anthropogenic OA as a driver behind observed negative responses (Bednaršek et al., 2014, 2020; Osborne et al., 2020). Due to the shortness of time series, population-specific measurements linked to in situ anthropogenic CO<sub>2</sub> are still lacking.

It is particularly important to address the risks related to anthropogenic drivers on regional scales because of their connection to local economies based on marine resources, fisheries, and recreation (Barange et al., 2014; Gattuso et al., 2015). Fingerprinting of the anthropogenic OA signal is particularly essential in estuarine systems that support structural and functional biodiversity and productivity in order to evaluate, manage, and limit the risks to habitats. However, these systems are characterized by extensive spatial and seasonal variability and prolonged time of emergence (Cai et al., 2011; Sunda and Cai, 2012; Feely et al., 2018; Sutton et al., 2019), and conclusively linking anthropogenic attribution to baseline shifts is difficult.

Despite this, recent studies have identified remarkably consistent bounds for anthropogenic CO<sub>2</sub> concentrations for the coastal waters of the California Current Ecosystem and the Salish Sea (Feely et al., 2016; Evans et al., 2019).

The Salish Sea in the Pacific Northwest is one of the most productive estuarine systems in the United States with many ecologically, economically, and culturally significant species. Yet, the Salish Sea is rapidly changing because of its poor buffering capacity (Feely et al., 2010, 2012, 2018; Fassbender et al., 2018; Evans et al., 2019) and multiple anthropogenic and natural drivers that can simultaneously exacerbate OA, including freshwater (riverine) inputs, respiration processes, and other redox reactions (e.g., Feely et al., 2010, 2016, 2018; Alin et al., 2018; Evans et al., 2019, and references therein). Anthropogenic CO<sub>2</sub> uptake and local eutrophication enhancing respiration have been recognized as the most important contributions to changing OA baseline conditions (Feely et al., 2010, 2012, 2018; Pelletier et al., 2017, 2018; Bianucci et al., 2018; Evans et al., 2019). Anthropogenic CO<sub>2</sub> concentrations are changing surface ocean habitats following the exchange of CO2 across the air/water interface, with increased concentration of dissolved inorganic carbon (DIC) from the atmosphere.

While these processes are subjecting ecologically and economically important calcifying species to enhanced anthropogenic OA exposure (Feely et al., 2016, 2018), the understanding of OA's impacts on important species to the Salish Sea ecosystem is currently restricted to experimental results and food web model outputs of projected OA changes. Several studies demonstrate the most damaging OA impacts on various pelagic calcifiers, including pteropods, benthic grazers, and Dungeness crabs (Busch et al., 2013, 2014; Miller et al., 2016). However, because of the uncertainties associated with extrapolating from experimental results to highly variable estuarine conditions, OA risk assessment across spatial and temporal windows of exposures is limited.

Pteropods are ecologically important as a food resource for various fish (Aydin et al., 2005), and are regarded as sensitive OA indicators of ecological health (Bednaršek et al., 2017b). Their OA sensitivity is related to multiple pathways ranging from shell dissolution, physiological and behavioral responses, and mortality (Lischka et al., 2011; Busch et al., 2014; Bednaršek et al., 2017a,b). As described by Wang et al. (2018) and Bednaršek et al. (unpublished), pteropod life history in the Salish Sea consists of are two major spawning events in the Salish Sea: a primary event occurs during the springtime (March-May) and a secondary event occurs in the fall (September-October), generating most sensitive early life stages that inhabit upper 100 m of their vertical habitat (Wang et al., 2018; Bednaršek et al., unpublished). A single field study so far in the Salish Sea shows evidence of negative biological effects, shell dissolution, under present OA gradients for pteropods (Bednaršek et al., unpublished); these findings are indicative of high pteropod sensitivity yet insufficient to accurately ascribe the risks for the pteropod community in the Salish Sea.

Dungeness crabs are the most important fishery in Washington State, with an estimated total value between \$90 and \$110 million annually (Childers, R., Washington Fish and

Wildlife, personal communication). Exposure to OA conditions is pre-determined by the life history of larval Dungeness crabs occurring during the springtime (May–June), with early life stages inhabiting upper 160 m of water column considered to be their diel vertical habitat in the Salish Sea (Jamieson and Phillips, 1993). Experimental analyses of the Dungeness crab demonstrate delayed development and increased mortality in the zoea stages (Miller et al., 2016), while megalopae show evidence of increased exoskeleton dissolution (Bednaršek et al., 2020). There is consistent evidence of a regionally limited population collapse of Dungeness crabs (Childers, R., Washington Fish and Wildlife, personal communication) but causality behind the observed phenomenon has not yet been determined because the pathways of sensitivity or attribution analyses to specific drivers are lacking.

To evaluate OA-related risks and uncertainties on biological populations, an understanding of two factors, i.e., species sensitivity and associated exposure to unfavorable OA conditions, is needed. Standardizing sensitivity across species, life stages, studies, and different approaches is difficult and potentially biased. In the absence of a comprehensive understanding of species sensitivity, needed to predict future OA effects, the United Nations Intergovernmental Panel on Climate Change (IPCC) uses thresholds with associated confidence levels to communicate the risks (Mastrandrea et al., 2010). Biological thresholds are recommended tools for evaluating species sensitivity, especially when derived through the expert consensus process (Mastrandrea et al., 2010; Bednaršek et al., 2019). As such, they can be used to assess biological vulnerability when there are gaps in the empirical evidence. Although there is a significant gap of known OA thresholds for most marine organisms, such thresholds are currently available for different life stages of pteropods (Bednaršek et al., 2019). The biological thresholds cover a range of conditions specifically related to aragonite saturation state  $(\Omega_{ar})$  that can induce either sublethal (increased dissolution, reduced growth) or lethal (mortality) effects. Species life histories provide a context for interpreting sensitivity during their most sensitive biological stages (Bednaršek et al., 2019).

In regard to OA exposure in regionally specific coastalestuarine ecosystems, downscaled biogeochemical models are among the best tools for evaluating current conditions and predicting changes against a background of ocean variability. More importantly, they can help delineate the location and potential impact of specific anthropogenic stressors, such as atmospheric CO2 addition or eutrophication, as well as quantitatively assess the changes to either of these two stressors. Biological thresholds can be incorporated easily into biogeochemical models as an application tool to identify spatially explicit OA hotspots and refugia, as well as temporal windows in which the biological risks will be most significant. Furthermore, applying thresholds to biogeochemical models with distinct "scenarios" can help delineate the extent of currently observed biological impacts due to a specific anthropogenic OA driver, e.g., CO<sub>2</sub> emissions vs. nutrient loading.

The application of biological thresholds into the Salish Sea Model (SSM) to identify spatial and temporal windows of conditions that induce sublethal and/or lethal biological effects is a novel approach in assessing risk associated with OA. Here, we apply a highly resolved biogeochemical SSM to assess the changes in chemical exposure since the pre-industrial era using an attribution analysis of atmospheric CO<sub>2</sub> emissions and nutrient-driven eutrophication in the Salish Sea. Metrics of exposure (duration, intensity, severity) were modeled to delineate predominant anthropogenic drivers, atmospheric CO<sub>2</sub> and nutrient-related eutrophication, and discern their effects across spatial and temporal scales since the pre-industrial era. We conducted OA risk analyses using two pelagic calcifiers with the greatest predisposition to exposure and demonstrated vulnerability to OA conditions in the Salish Sea: pteropods (Limacina helicina) and larval stages of Dungeness crab (Metacarcinus magister). The interpretation of their biological risks was based either on the biological thresholds (pteropods, Bednaršek et al., 2019) or sensitivity equation related to the OA conditions (larval Dungeness crabs, Bednaršek et al., 2020). In doing so, we were able to determine current risks facing ecologically and economically important species in the Salish Sea, as well as delineate the anthropogenic drivers associated with the greatest risk for species sustainability.

### **MATERIALS AND METHODS**

### **Description of the Salish Sea Model**

This project utilizes a recently completed physical-biogeochemical model for the Salish Sea coastal waters developed by the Pacific Northwest National Laboratory (PNNL) and the Washington State Department of Ecology (DOE) (Pelletier et al., 2017; Bianucci et al., 2018). Our project focus is on the Salish Sea; therefore, we call it the SSM, but the model domain also extends into the Strait of Juan de Fuca and Strait of Georgia. The hydrodynamic module of the SSM is an application of the Finite-Volume Community Ocean Model (FVCOM; Chen et al., 2003).

The SSM uses an unstructured grid that represents the complex shoreline, islands, bathymetry, and waterways of the Salish Sea. The unstructured SSM grid consists of 9,013 nodes and 13,941 elements. The vertical resolution of the model employs a sigma coordinate system with 10 layers. Layer thicknesses are distributed with highest density near the surface. The thickness of the surface layer ranges from about 0.16 m in the shallow nearshore areas to 7.6 m in the deepest areas, with an average thickness of about 1.9 m across the model domain. The thickness of the bottom layer ranges from about 0.75 m in the shallow nearshore areas to 35 m in the deepest areas, with an average thickness of about 8.6 m across the model domain. The number of model grid layers within the euphotic zone depth of approximately 20 m varies from all 10 layers in the nearshore regions to the top two layers in the deepest areas.

The biogeochemical module of the SSM is adapted from the Integrated Compartment Model (CE-QUAL-ICM; Cerco and Cole, 1993, 1994). Bianucci et al. (2018) extended the SSM to include carbonate system variables, i.e., total alkalinity (TA) and DIC in the water column and a two-layer sediment diagenesis module (Di Toro, 2001). The SSM is driven by

boundary conditions at two open boundaries (Strait of Juan de Fuca and Strait of Georgia), nearly 100 freshwater sources, including rivers, other watershed sources, and wastewater treatment plants, and meteorological forcing at the water surface. The SSM tracks the following state variables: phytoplankton (two groups), nutrients (nitrate, ammonium, and phosphate), dissolved oxygen, dissolved and particulate organic carbon and nitrogen (labile and refractory), alkalinity, and DIC. The SSM is an offline model that uses input from a previously computed hydrodynamic solution. A detailed description of the SSM is provided by Yang et al. (2010), Khangaonkar et al. (2011), Khangaonkar et al. (2012), and Kim and Khangaonkar (2012).

The model setup for realistic historical conditions in 2008 is exactly the same as described by Bianucci et al. (2018), except for the following changes to better represent model boundary conditions:

- Monthly averages were used to represent alkalinity in rivers instead of using a constant value for each river for the entire year, using the same data sources described by Bianucci et al. (2018);
- Atmospheric *x*CO<sub>2</sub> of 390 ppm was used instead of 400 ppm to better match the observed data off the coast of Washington during 2008 (PSEMP Marine Waters Workgroup, 2016).

### **Model Scenarios**

Several model runs were used in this project to represent the following scenarios:

- (1) Existing conditions in 2008. These are the realistic historical conditions observed in 2008 (referred as S1Ex);
- (2) Hypothetical reference conditions in 2008 without regional human nutrients. This is the same as Scenario 1, except with regional anthropogenic sources of nutrients removed (e.g., wastewater treatment plant loads and freshwater anthropogenic nonpoint sources). The regional anthropogenic nutrient loads that were excluded from the reference condition scenario include anthropogenic inorganic N (nitrate and ammonium), dissolved and particulate organic N, and dissolved and particulate organic carbon (referred as S2Ex-nut);
- (3) Hypothetical reference conditions without global anthropogenic CO<sub>2</sub>. This is the same as Scenario 1 except with atmospheric and ocean boundary partial pressure of CO<sub>2</sub> (pCO<sub>2</sub>) and DIC reduced to pre-industrial conditions (referred as S3Ex-atm);
- (4) Hypothetical pre-industrial conditions without global anthropogenic CO<sub>2</sub> or local human nutrients. This is the same as Scenario 1, except with atmospheric and ocean boundary pCO<sub>2</sub> and DIC reduced to pre-industrial conditions and regional anthropogenic nutrient sources excluded (referred as S4Ex-nut-atm);
- (5) Hypothetical conditions from the years 1780 to 2100 in response to changing global CO<sub>2</sub> under RCP 8.5. This is a set of 17 separate scenarios that are same as Scenario 1, except with atmospheric and ocean boundary pCO<sub>2</sub> and

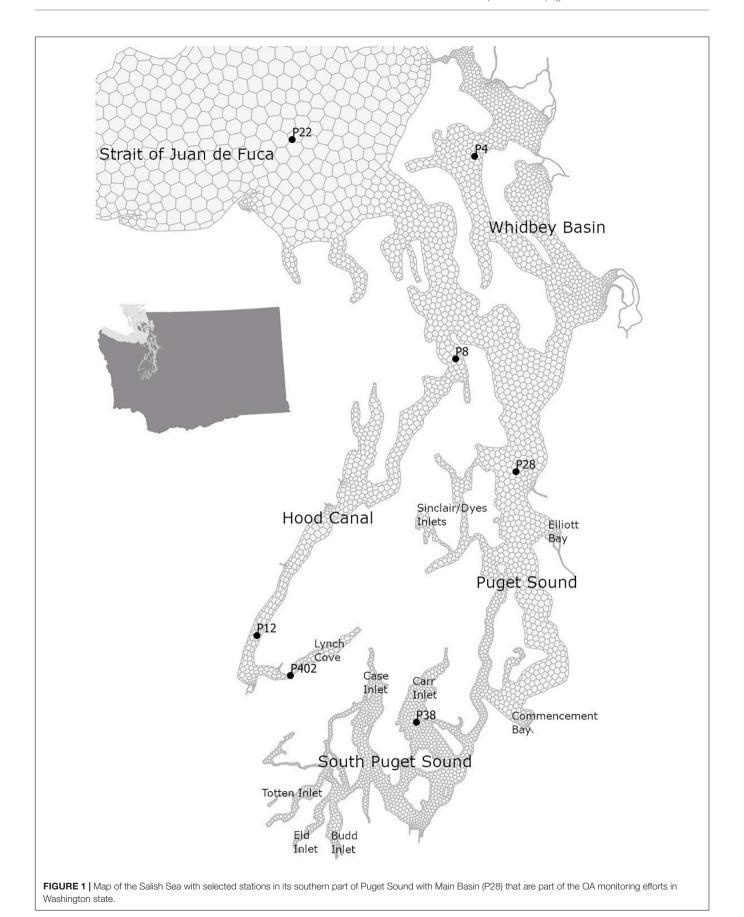
DIC changed to reflect projected conditions between the years 1780 and 2100 with atmospheric increase from 280 to 910 ppm (Scenario 5, S5-Future).

The effects of regional anthropogenic nutrient sources on water quality were evaluated by analyzing the difference in results between the historical conditions in 2008 and the reference conditions with human nutrients excluded [difference between Scenario 1 (S1Ex) and 2 (S2Ex-nut)]. Regional anthropogenic nutrient sources that were removed in the reference conditions include the anthropogenic component of loading in the wastewater treatment plants and all freshwater sources within Washington State. The effects of global anthropogenic sources of CO2 were evaluated by analyzing the difference in results between the historical conditions in 2008 and the reference conditions with global anthropogenic CO2 excluded [difference between Scenario 1 (S1Ex) and 3(S2Ex-atm)]. The combined effect of global anthropogenic CO<sub>2</sub> and human nutrient sources was based on the difference between Scenarios 1 (S1Ex) and 4 (S4Ex-nut-atm).

The method used to calculate DIC at the ocean boundary under pre-industrial conditions assumes that pCO<sub>2</sub> in the water is increased at the same rate as in the atmosphere (Takahashi et al., 2009). Atmospheric CO<sub>2</sub> was 390 ppm in 2008 and 280 ppm under pre-industrial conditions; therefore, the difference of 110 ppm was subtracted from the 2008 ocean boundary pCO<sub>2</sub> in the water to estimate ocean boundary pCO<sub>2</sub> under pre-industrial conditions, and pre-industrial DIC was calculated with CO2SYS (Lewis and Wallace, 1998; Evans et al., 2019).

The methods used to estimate the nutrient loading from all existing sources and reference conditions (with estimated regional anthropogenic sources excluded) are presented in Mohamedali et al. (2011) and Pelletier et al. (2017). Regional anthropogenic sources of nutrients that were removed from the reference conditions include wastewater treatment plant loads and freshwater anthropogenic nonpoint sources of nutrients, including anthropogenic inorganic N (nitrate and ammonium), organic N (dissolved and particulate), and organic carbon (dissolved and particulate). Natural reference conditions were established from the results of a meta-analysis considering concentration data from various sources (Mohamedali et al., 2011): ambient monitoring data, rainfall data, and data from other studies. Monthly 10th percentiles of ambient data were used to represent natural nutrient concentrations for different regions in Puget Sound and the Strait of Georgia. Monthly 50th percentiles were used for the Olympic Peninsula watersheds draining to the Strait of Juan de Fuca and Hood Canal.

We demonstrate the effects of the changes in carbonate chemistry conditions over the entire Salish Sea region through the model outputs, and additionally focus on the stations in Puget Sound, which represent the southern part of the Salish Sea where current OA monitoring is taking place (**Figure 1**). All of the model scenarios used in this study use the same hydrodynamic and physical conditions as the year 2008. Therefore, the differences between scenarios isolate the effects of only regional human nutrients and global anthropogenic CO<sub>2</sub>.



# **Determining the Exposure and Sensitivity** for Two Groups of Marine Calcifiers

The availability of tools that allow interpretation of *biological sensitivity*, as well as model outputs that allow assessment of *chemical exposure*, made it possible to evaluate the risks for two pelagic calcifiers, i.e., pteropods and larval stages of Dungeness crabs.

Depending on the application of the tools in the biogeochemical model, the exposure can be assessed temporally and spatially. In assessing temporal exposure, we applied the sensitivity tools across different seasonal scales that align with the species life history, i.e., when the magnitude of seasonal exposure co-occurs with the most sensitive biological processes. Spatial sensitivity was assessed over the entire Salish Sea, which is the spatial domain of the SSM biogeochemical model.

Pteropods in the Salish Sea inhabit the upper 100 m water column and undergo two spawning events. One event occurs in the springtime (March–May) and the other occurs in the fall (September–October). For pteropods, biological sensitivity is based on thresholds describing the sublethal and acute biological responses that were derived through expert consensus (Bednaršek et al., 2019). Each of the six thresholds in the study was assigned a specific confidence score, which was based on the combination of evidence and agreement (Mastrandrea et al., 2010).

Life history context was used for assessing the OA risks to larval Dungeness crabs considering their diel vertical migration pattern within the upper 160 m during the spring (May-June). Biological thresholds, however, were not available for the larval Dungeness crabs. Consequently, we used the equation that best describes their sensitivity against regionally specific OA gradients (Bednaršek et al., 2020). Larval stages of the Dungeness crab are susceptible to OA exposure, which can induce internal and external exoskeleton carapace dissolution (Bednaršek et al., 2020). Internal dissolution was correlated against calcite saturation state ( $\Omega_{cal}$ ; Eq. 1; p = 0.003), derived from in situ vertical coastal gradients at the stations along Washington's coast that are interconnected with the waters of the Salish Sea. Because of the regional similarity, we extrapolated this equation to the waters of the Salish Sea. The extent of internal dissolution is associated with extracellular acid-base control, which is linked to increased energetic demands and thus related to physiological impairments (Michaelidis et al., 2005; Hans et al., 2014; Bednaršek et al., 2020).

While evaluating the risks of sublethal exposure is simple, interpreting the risks at the population level is more complex and multifaceted. Here, we consider population-level effects to be most significant if anthropogenically induced OA conditions result in exposure inducive to the mortality threshold, particularly during the most vulnerable early-life stages. Alternatively, if the magnitude of exposure inducive to sublethal effects prevails for a prolonged time, it can contribute to compromised organismal performance and thus indirectly induce mortality. As such, we delineate the exposure related to sublethal effects on either seasonal (September–October or January-February) or annual

bases to provide us with different temporal windows of OA-associated risks.

# Applied Thresholds or Sensitivity Equations for Pteropods and Dungeness Crabs

Pteropod thresholds describe biological condition gradients ranging from sublethal biological effects (mild to severe dissolution, growth impairment) to lethal effects (survival). Each pteropod threshold is associated with the magnitude ( $T_{mag}$  in units of  $\Omega_{ar}$ ) and duration ( $T_{dur}$  in units of days) of exposure at which significantly negative impacts occur. Each threshold is additionally characterized by a confidence score determined by using a combination of the evidence and agreement, as based on the IPCC approach (Mastrandrea et al., 2010; Bednaršek et al., 2019).

Pteropod thresholds were applied over the upper 100 m integrated water column, which delineates the vertical habitat of pteropods in the Salish Sea. We conducted the application for three thresholds:

- 1. Mild dissolution (sublethal response;  $\Omega_{ar} = 1.5$  for 5 days; high confidence score)
- 2. Growth impairment (sublethal response;  $\Omega_{ar} = 1.0$  for 7 days; medium confidence score)
- 3. Mortality (lethal response;  $\Omega_{ar} = 0.95$  for 14 days; low confidence score).

For larval Dungeness crab, we used the equation (Eq. 1) for  $\Omega_{cal}$  over the upper 160 m water column to delineate the sublethal effects in the Salish Sea. Since the megalopae build their exoskeleton of calcite, the model outputs are in calcite saturation state ( $\Omega_{cal}$ ), which is linearly correlated to  $\Omega_{ar}$ . Internal dissolution describes a relative extent of dissolution per each individual (Bednaršek et al., 2020).

Internal dissolution = 
$$-0.448 \Omega_{cal} + 1.147$$
 (1)

# **Evaluation of Biological Thresholds Using Model Outputs**

Conditions of adverse  $\Omega_{ar}$  below biological thresholds for pteropods are defined as the cumulative length of time with duration (D, days) of  $\Omega_{ar}$  less than the defined threshold magnitude value ( $T_{mag}$ ) for all events that each have time periods greater than the defined threshold for duration of each event ( $T_{dur}$ ). We adopt the approach of Hauri et al. (2013) to define the intensity (I, unitless) of adverse events as:

$$I = T_{\text{mag}} - \Omega_{\text{ar,mean}} \tag{2}$$

where  $\Omega_{ar,mean}$  is the mean  $\Omega_{ar}$  averaged over the time of the event. The intensity represents the average magnitude of decrease in  $\Omega_{ar}$  below the threshold during events. Both duration and intensity have an impact on health of organisms (e.g., Beesley et al., 2008), therefore the combined effect of duration and intensity is represented by a metric called severity (S, omegadays):

$$S = I \times D \tag{3}$$

The following steps are involved in processing the model outputs:

- (1) Extract the time series of predicted  $\Omega_{ar}$  values and adjust for average model bias of -0.08 units. Model outputs are a continuous time series of predicted  $\Omega_{ar}$  values at intervals of every 6 h;
- (2) Step through the time series of bias-adjusted omega values to identify all events that have magnitudes less than  $T_{mag}$  for event durations greater than  $T_{dur}$ ;
- (3) Calculate the cumulative duration integrated across all events for the time period being evaluated (e.g., annual or seasonal);
- (4) Calculate the cumulative intensity during events integrated across all events using Eq. 2;
- (5) Calculate the integrated severity across all events from the cumulative duration and intensity using Eq. 3.

### **RESULTS**

# Carbonate Chemistry Changes Due to Anthropogenic Contributions

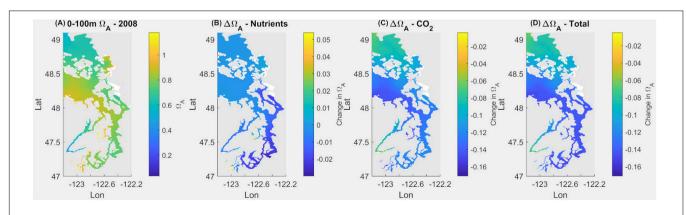
Under the current conditions (Scenario 1; S1Ex) in the upper 100 m, about 94% of surface area of the Salish Sea has an average  $\Omega_{ar} < 1$  annually, with the remaining 6% ranges of  $1 < \Omega_{ar} < 1.2$ (Figure 2 and Table 1). The worst conditions, in terms of the intensity, are located in the stratified bays of Hood Canal (stations P12 and P402), Whidbey Basin (station P4), and the northern part of the Salish Sea (station P28; Figure 2 and Table 1). Since pre-industrial times,  $\Omega_{ar}$  conditions have been significantly affected by anthropogenic inputs, particularly atmospheric CO<sub>2</sub>. The annual mean  $\Omega_{ar}$  over the 0-100 m depth range was 0.91 in the pre-industrial period compared to the current value of 0.8. The difference between current and pre-industrial watercolumn averages is nearly the same regardless of depth, while the average  $\Omega_{ar}$  is higher toward the shallower depths (**Table 1**). In comparison, the mean pH for 0-100 m across the entire system is currently 7.69, while in the pre-industrial it was 7.76. The carbonate chemistry in the Main Basin (station P28) and various sub-basins have been mostly affected by atmospheric  ${\rm CO_2}$  uptake (**Table 1** and **Figures 2**, **3**). These changes indicate that anthropogenically induced OA significantly increases the exposure below biological thresholds of pelagic calcifiers, i.e., pteropods and larval crabs. Spatially, the most affected habitats are the stratified bays of Hood Canal (station P12, P402), South Sound (station P38), and Whidbey Basin (station P4). With respect to the nutrient impacts, the calculated annual mean change in pH and  $\Omega_{\rm ar}$  is everywhere close to or below the root mean squared error (RMSE) of the SSM.

Anthropogenic inputs play a major role in lowering  $\Omega_{ar}$  on a seasonal basis, with unequal contributions to the baseline  $\Omega_{ar}$  shifts during different seasons and locations. In terms of the latter, the underlying variability in carbonate chemistry dictates the changes due to anthropogenic inputs with a lower mean and amplitude of change, but the same frequency (**Figure 3**). In this manner, different regions exhibit different patterns. For example, the greatest difference in total change since the pre-industrial period appears to be at the deeper, well-mixed stations (e.g., P8, P28), while anthropogenic impacts are the smallest in the Hood Canal (P4 and P12; **Figure 4**).

When assessing estuarine habitat conditions, we separated habitats into two categories: first, the habitats with a low  $\Omega_{ar}$  baseline level in which exposure can induce biological risk, while the anthropogenic component only adds to a minor extent of the overall change (0.06–0.08  $\Omega_{ar}$ ). Such is the case at stations P12 and P402 (**Figure 4**). Second, the habitats with higher  $\Omega_{ar}$  levels where the anthropogenic component contributes to more significant changes, with  $\Omega_{ar}$  change up to 0.15 at stations P8, P4, P28, and P38 (**Figure 4**).

### Impacts of Nutrient-Driven Eutrophication

The observed trends show that nutrient-driven eutrophication impacts on  $\Omega_{ar}$  changes are largely dependent on primary production and respiration processes, and can have positive or negative effects, respectively, depending on spatial location and season. Based on the seasonally specific distributions, the greatest magnitude in  $\Omega_{ar}$  change over the upper 100 m occurs during the early spring and late autumn period at stations



**FIGURE 2** | Current omega saturation state ( $\Omega_{ar}$ ) averaged over 100 m in the Salish Sea (A), with the changes in  $\Omega_{ar}$  due to nutrients (B), atmospheric CO<sub>2</sub> (C), and a combination of both (D).

**TABLE 1** Quantitative changes in omega saturation state due to nutrients, atmospheric  $CO_2$ , and the combination of both at 100 m depth

Mean_pHtot_KT100       7.69         Mean_OmegaAr_KT100       0.80         P12_pHtot_KT100       7.51         P12_omegaAr_KT100       7.78         P22_pHtot_KT100       7.73         P28_pHtot_KT100       7.73         P28_OmegaAr_KT100       0.87         P38_OmegaAr_KT100       0.87         P38_OmegaAr_KT100       0.87         P38_OmegaAr_KT100       0.87	7.70 0.80 7.52 0.59 7.78	7.75 0.90 7.57	(	combined (Scenario 1–4)		(Scenario 1–2)
0	0.80 7.52 0.59 7.78	0.90	7.76	-0.067	090'0-	-0.007
	7.52 0.59 7.78	7.57	0.91	-0.111	-0.104	-0.006
	0.59		7.58	-0.069	-0.062	-0.007
	7.78	99.0	0.66	-0.080	-0.072	-0.007
		7.85	7.85	-0.071	-0.070	-0.001
	96.0	1.10	1.10	-0.142	-0.141	-0.001
00 00	7.74	7.80	7.81	-0.079	690'0-	-0.009
00	0.89	1.00	1.02	-0.143	-0.126	-0.015
100	7.73	7.78	7.80	-0.082	-0.067	-0.015
	0.88	0.98	1.01	-0.143	-0.118	-0.021
	7.72	7.78	7.79	-0.082	0.070	-0.012
P4_OmegaAr_KT100 0.82	0.83	0.94	0.95	-0.136	-0.117	-0.016
P402_pHtot_KT100 7.48	7.48	7.53	7.54	-0.064	-0.057	900.0—
P402_OmegaAr_KT100 0.57	0.57	0.63	0.64	-0.069	-0.064	-0.004
P8_pHtot_KT100 7.77	7.77	7.84	7.84	-0.071	-0.068	-0.002
P8_OmegaAr_KT100 0.95	0.95	1.08	1.09	-0.138	-0.135	-0.003

P28 and P38 (Figures 3, 4). When  $\Omega_{ar}$  is above 1-1.2 in the upper water column, the effect of added nutrients increases  $\Omega_{ar}$  because the addition of eutrophication fuels primary production, which increases  $\Omega_{ar} > 1$  in near-surface waters. In this region, increased nutrient loading induces greater organic production and uptake of CO<sub>2</sub> from the water by phytoplankton. When the additional phytoplankton settles to deeper depths, the decomposition of organic matter via respiration processes releases CO<sub>2</sub>. Consequently, the added nutrients contribute to greater decomposition of organic carbon, decreased pH, and lower  $\Omega_{ar}$  values in deeper waters. This is reflected in the shape of the curve describing baseline vs. change in  $\Omega_{ar}$  due to anthropogenic nutrients (at different regions throughout the year; Figures 3-5), the negative values of change in  $\Omega_{ar}$ (indicating decrease in  $\Omega_{ar}$  due to added nutrients), and the decreasing slope of the curve with decreasing  $\Omega_{ar}$  < 1 values at most stations (Figure 5).

### Model Skill

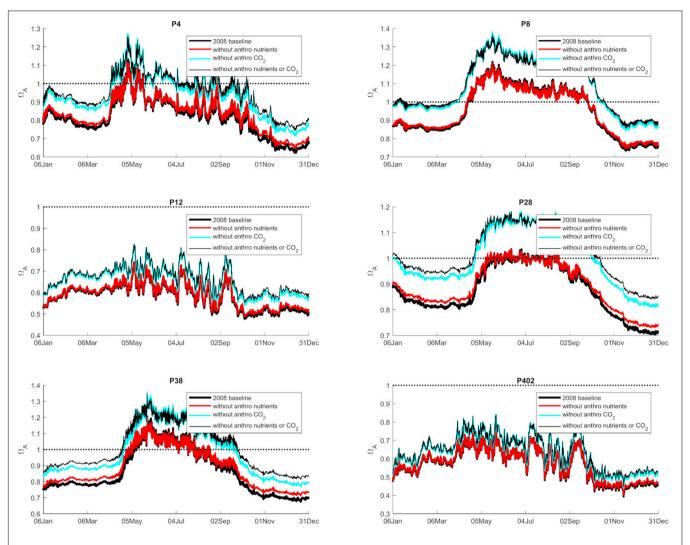
Root mean squared error and bias are appropriate measures of model skill for numerical biogeochemical models (Stow et al., 2009). Average model RMSE and bias for  $\Omega_{ar}$  is  $\pm 0.29$ and -0.08, respectively. Average RMSE and bias for pH is  $\pm 0.12$  and -0.05, respectively. The model predictions of  $\Omega_{ar}$ and pH were adjusted by the average model bias before reporting summary statistics or comparing with thresholds. In this report we use the model to calculate differences in carbonate system variables between realistic historical conditions in 2008 (Scenario 1: S1Ex, also referred to as "existing conditions") and the other model scenarios to estimate the changes caused by anthropogenic CO<sub>2</sub> and nutrients. Because the results of the different model scenarios are highly correlated with the existing conditions, the RMSE of the differences between scenarios is much less than the RMSE of the existing conditions. Pelletier et al. (2017) estimate the RMSE of predicted anthropogenic changes in pH and  $\Omega_{ar}$  to be  $\pm 0.006$  and  $\pm 0.03$ , respectively, using the SSM.

### Threshold Application

### Chemical Exposure Related to Pteropod Sublethal Thresholds

Sublethal and lethal pteropod thresholds were examined separately to ascribe the range of biological responses, from the subacute (dissolution and growth impairment) to the acute (mortality).

The most sensitive of the sublethal thresholds is mild shell dissolution ( $\Omega_{ar}=1.5$  for 5 days), which describes the early warning stage of pteropod sensitivity (**Figure 6**). Under the current conditions, the duration of exposure for these thresholds occurs throughout the year (**Figure 6A**), with the intensity of exposure at 0.4–0.6  $\Omega_{ar}$  unit below the thresholds (**Figure 6G**), which is almost uniformly distributed within the Salish Sea basin. While the duration of exposure has not changed since pre-industrial times (**Figure 6D**), the intensity of exposure has increased from 0.06 in the smallest bays and inlets of the Hood Canal and the South Sound to 0.16  $\Omega_{ar}$  unit in

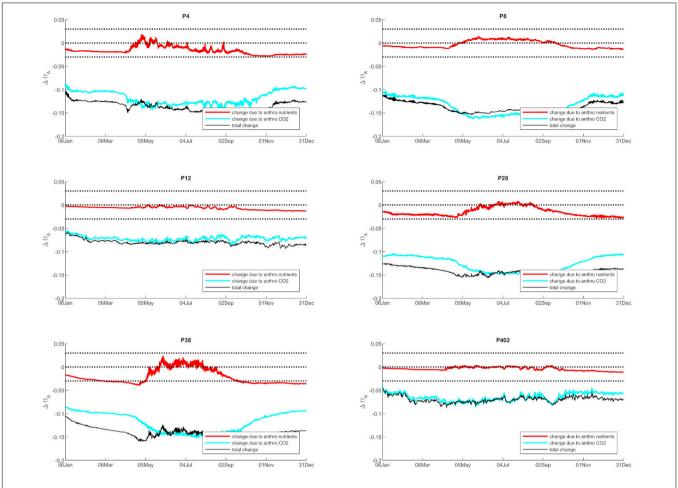


**FIGURE 3** | Graphical representation of the average annual 0–100 m values of  $\Omega_{ar}$  (2008 baseline), and separated as a contribution to nutrients, atmospheric CO<sub>2</sub>, and both at six selected stations in Puget Sound (P4, P8, P12, P28, P38, P402 with locations shown in **Figure 1**).

the Main Basin (station P28) and most of the South Sound (station P38; **Figure 6J**), mostly due to the atmospheric CO<sub>2</sub> uptake (60–90%; **Figures 6I,L**). Moreover, the nutrient-driven eutrophication contributes, on average, a 10% increase in the intensity of exposure across the wider Salish Sea, while up to 20–40% increase (up to 0.05  $\Omega_{\rm ar}$  unit) occurs in the smaller inlets of the South Sound (**Figure 6K**). The increase in severity of exposure resembles the intensity (**Figures 6M–R**). Our results suggest that nutrient-driven eutrophication might increase pteropod exposure inducive of mild dissolution during the late fall to early spring period in the smaller inlets of the South Sound, an increase that is greater than the model RMSE of 0.03  $\Omega_{\rm ar}$  unit (**Figure 4**).

The sublethal threshold of growth impairment ( $\Omega_{ar} = 1.2$  for 14 days; **Figure** 7) was applied in the SSM during the fall (September–October), co-occurring with the sensitive time period of growth of the secondary spawning pteropod cohort. During this period, the duration of exposure below the threshold

is 40-60 days (Figure 7A). Since the pre-industrial period, this duration has increased from 10 to up to 50 days in the small inlets of the South Sound (station P38) and the Main Basin (station P28), respectively (Figure 7D). The model output of present-day  $\Omega_{ar}$  exposure related to the intensity shows the conditions to be 0.1–0.4  $\Omega_{ar}$  unit below the growth impairment threshold (Figure 7G). The intensity-related conditions have changed considerably since pre-industrial times, with up to a 70-100% increase in the South Sound and the Main Basin due to atmospheric CO2 emissions (Figures 7J-L). A change of up to 30% (with more than 0.03  $\Omega_{ar}$  unit change) can be attributable to nutrient-driven eutrophication in the long, stratified embayments of the South Sound during the fall to spring period (Figure 7K), possibly triggering growth impairment. Moreover, when applying growth thresholds to the fall-winter period (November-February), the conditions can induce the same extent of sublethal responses as in the fall, indicating that pteropod sublethal processes are affected for



**FIGURE 4** | The changes in  $\Omega_{ar}$  due to anthropogenic nutrients (red line) and atmospheric CO<sub>2</sub> (blue line), while the black line represents the total change from both nutrients and atmospheric CO<sub>2</sub> at six selected stations in Puget Sound (P4, P8, P12, P28, P38, P402 with locations shown in **Figure 1**).

a prolonged period, resulting in more severe exposure than predicted if only a limited time period is considered.

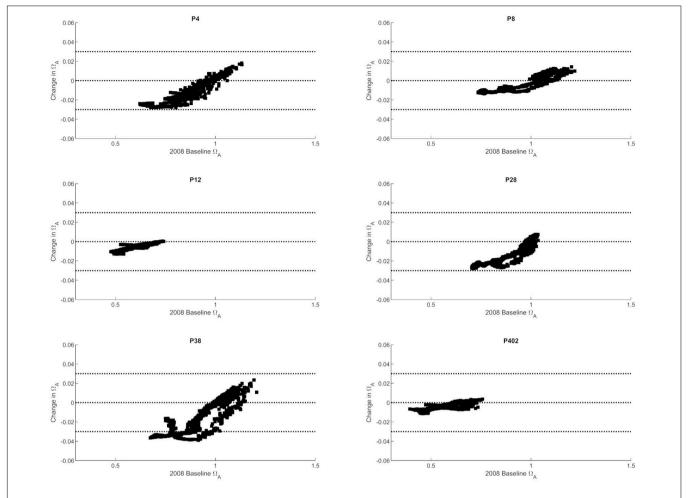
### Chemical Exposure Related to Pteropod Lethal Thresholds

Model outputs with applied mortality thresholds ( $\Omega_{ar} = 0.95$ for 14 days) demonstrate that various regions under present-day conditions are differentially affected in their duration of exposure on an annual basis. The largest duration and intensity of exposure is in the northern part of the Salish Sea (station P22), Whidbey Basin (station P4), and Hood Canal (Figure 8). The exposure is below the survival threshold for a considerable amount of time and magnitude, ranging from 70 to 300 days in the Main Basin (station P28) and Hood Canal (stations P402 and P12), respectively (**Figure 8A**), and intensity in the range of  $0.1-0.4 \Omega_{ar}$ (**Figure 8B**). When exposure was considered across the seasonal time scale, we observed conditions below the survival threshold to be prevalent during the late summer to early spring period. This indicates that vital population processes are affected for a prolonged duration and could subsequently result in changes on the population level.

Since pre-industrial times, the overall change of 0.11  $\Omega_{ar}$  (Figure 8J), with 70–90% of the change attributable to atmospheric CO<sub>2</sub> uptake, occurred within the Main Basin, the northern part of the Salish Sea, and Hood Canal (Figures 8I,J). Comparatively, the impact of nutrient-driven eutrophication since pre-industrial times was not significant (Figures 8H,K).

### Impact of Anthropogenic OA on the Larval Stages of Dungeness Crab

Exposure to current  $\Omega_{cal}$  during the springtime (May–June) induces a spatially differential extent of internal dissolution of the larval stages of the Dungeness crab (**Figure 9**). The most severe extent of internal dissolution occurs in the Hood Canal, Whidbey Basin, and partially in the South Sound (**Figure 9A**). The lowest baseline  $\Omega_{cal}$ , which occurs in the early spring and fall–winter periods (**Figure 4**), coincides with the increases in internal dissolution over the same seasonal scales. The magnitude of exposure since pre-industrial times has resulted in increased internal dissolution of 20–30% across the Salish Sea. A few spatially limited bays of the South Sound have experienced more than a 60% increase (**Figure 9D**). In terms of attribution, CO<sub>2</sub>



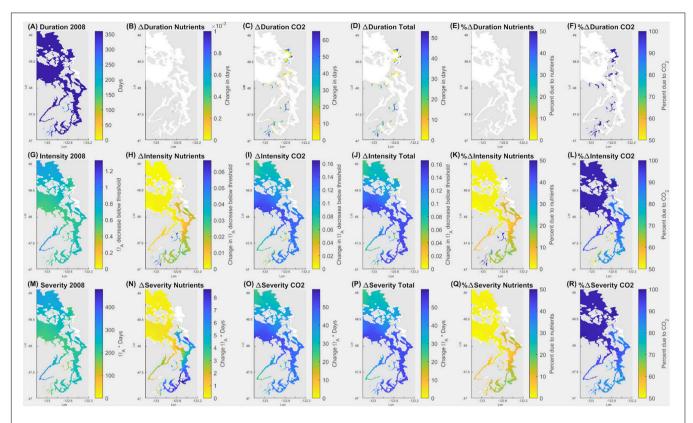
**FIGURE 5** | The correlation between baseline  $\Omega_{ar}$  (as modeled for 2008) and changes in  $\Omega_{ar}$  at six selected stations in the Puget Sound (P4, P8, P12, P28, P38, P402 with locations shown in **Figure 1**).

emissions uptake results in the greatest increase in internal dissolution (Figure 9C), while nutrient-related eutrophication caused an insignificant increase (Figure 9B). Areas currently exhibiting the most extensive dissolution are not always the same as the areas with the most rapid change. This is evident where changes related to the combination of both anthropogenic stressors are larger than the current state of internal dissolution (Figures 9A vs. 9C) regionally in the South Sound, Sinclair, and Dyes Inlets.

### Temporal and Spatial Scale of Anthropogenic Drivers Inducing Negative Biological Responses

In evaluating the impact of the anthropogenic drivers since preindustrial times, there are differences in the spatial and temporal extent of impact between two anthropogenic drivers, i.e., atmospheric  $\rm CO_2$  emissions and nutrient-related eutrophication. As such, the contributions of each to driving the conditions below the biological thresholds are different. The results of the attribution analyses show a predominant impact of

anthropogenic CO<sub>2</sub> from atmospheric CO<sub>2</sub> emissions that increase the influx of DIC from the open ocean boundary, as well as the exchange of CO2 across the air/water interface, driving  $\Omega_{ar,cal}$  conditions below the sublethal and lethal thresholds. Such impacts have been observed over most spatial scales in the Salish Sea from the deeper basins to the inlets, although not to the same extent, with  $\Omega_{ar,cal}$  conditions in the deep basins being significantly more susceptible to the changes compared to the smaller bays and inlets. The Main Basin is consistently more affected by atmospheric CO2 than the inlets of the South Sound (Figures 2-4). The temporal attribution of atmospheric CO<sub>2</sub> impacts is equally noted across all the seasons, although at one station in the South Sound (station P38 in Carr Inlet), the greatest impact is during the fall to spring months (Figure 4). As such, atmospheric CO2 emissions directly contribute to the change in  $\Omega_{ar, cal}$ , and thus related duration, magnitude, and severity of exposure for major sublethal (shell dissolution and growth) and, possibly, lethal (mortality) biological effects (Figures 6, 7 vs. Figure 8), and thus increase in risk for both pteropods and larval Dungeness crabs.



**FIGURE 6** | Application of pteropod threshold for mild dissolution (5 days at  $\Omega_{ar} = 1.5$ ) over the annual scale in the upper 100 m in the Salish Sea. Model outputs demonstrate current (2008) duration, intensity, and severity of the conditions **(A,G,M)**. The second column indicates all the changes due to nutrients **(B,H,N)**; the third column is related to the changes due to atmospheric CO<sub>2</sub> **(C,I,O)**; and the fourth column **(P,J,P)** shows total changes due to both nutrients and atmospheric CO<sub>2</sub>. The fifth column **(E,K,Q)** depicts % changes in  $\Omega_{ar}$  due to nutrients, and the sixth column **(F,L,R)** is the % change in  $\Omega_{ar}$  due to atmospheric CO<sub>2</sub>. Values of zero are masked in white.

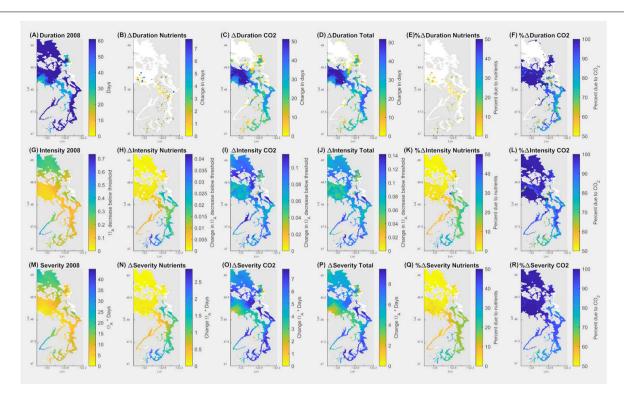
Eutrophication contributes to the change in  $\Omega_{ar,\,cal}$  conditions below the thresholds to a much smaller extent than atmospheric CO<sub>2</sub>. Since the change in  $\Omega_{ar}$  due to eutrophication is less than the model uncertainty, eutrophication plays an insignificant role across spatial and temporal scales for the annual mean (Figure 2). The change is the greatest when baseline  $\Omega_{ar,\,cal}$  conditions are already low, which occurs during the late summer to early spring period. Spatially, the attribution of nutrient-driven eutrophication on conditions above the 0.03  $\Omega_{ar}$  threshold was mainly observed in smaller, less vertically mixed bays and inlets of the South Sound, representative of the conditions at station P38 in Carr Inlet (Figure 4).

From a biological standpoint, added nutrients may have more adverse impacts on the lower thresholds when  $\Omega_{ar}$  is closer to or lower than 1.0 and can indirectly exacerbate biological status of organisms when they are already severely impacted (**Figures 4**, **5**). This could happen by small-scale reductions of the initially low baseline conditions that result in the threshold crossing during some months that can affect the most critical life stages, in the early spring and the late summer-early fall period. Namely, around  $\Omega_{ar} < 1.0$ , a very small reduction in  $\Omega_{ar}$  can shift the conditions inducive to sublethal processes toward lethal processes. On the other hand, the addition of nutrients in the spring and summer periods can increase  $\Omega_{ar} > 1$ , with

nutrients having a less detrimental effect, or in fact, partially alleviating OA stress. Overall, however, because of spatially and temporally limited impacts, we conclude that eutrophication contributes minimally to the change in chemical exposure and, thus, associated biological risks.

### **Future Projections**

Here, we demonstrate future projected changes related to the seasonal  $\Omega_{ar}$  distribution under RCP 8.5 for the year 2100 integrated for 0-100 m. We chose station P28 to represent a centrally located region of the Main Basin, of Puget Sound (Figure 10A), with the future projection scenario as described in Scenario 5 (S5-Future; see section "Model Scenarios"). The projections show a dramatic decrease in  $\Omega_{ar}$ . Pre-industrial summer conditions were mostly supersaturated  $(\Omega_{ar} > 1)$ . The increase in seasonal exposure is reflected in a reduced amount of time above the sublethal and lethal thresholds (Figure 9B). The conditions above the sublethal thresholds ( $\Omega_{ar}$  of 1.5, 1.2, and 1.0) start to rapidly decline in the past few decades and disappear before the year 2050. In contrast, the conditions above the lethal threshold ( $\Omega_{ar} = 0.9$ ) since pre-industrial times at first decline gradually, then exponentially over the last few decades, and completely disappear by the year 2050. Such exposure below



**FIGURE 7** | Application of pteropod threshold for growth impairment (7 days at  $\Omega_{ar} = 1.0$ ) over the seasonal scale in the upper 100 m of the Salish Sea during September–October. Model outputs demonstrate current (2008) duration, intensity, and severity of the conditions **(A,G,M)**. The second column indicates the changes due to nutrients **(B,H,N)**; the third column depicts the changes due to atmospheric  $CO_2$  **(C,I,O)**; the fourth column **(D,J,P)** shows total changes due to both nutrients and atmospheric  $CO_2$ . The fifth column **(E,K,Q)** depicts % changes in  $\Omega_{ar}$  due to nutrients, and the sixth column **(F,L,R)** is % change in  $\Omega_{ar}$  due to atmospheric  $CO_2$ . Values of zero are masked in white.

the thresholds can impose detrimental impacts on marine calcifiers' sustainability.

### **DISCUSSION**

### **Current and Future Exposures**

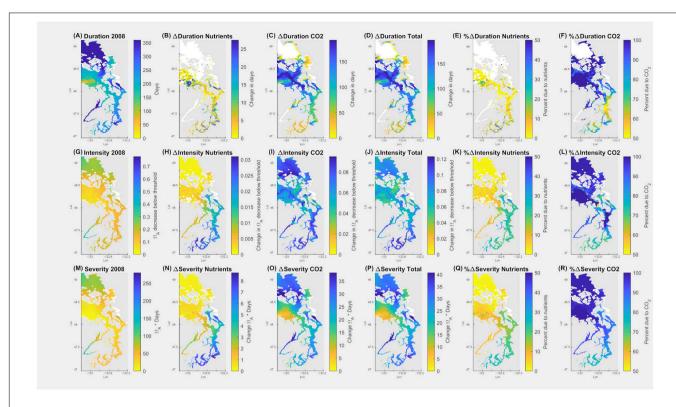
This is the first study along the United States West Coast that has considered the changes in OA exposure and risk to estuarine habitats using a combination of sensitivity tools and a highly resolved biogeochemical model. Our results demonstrate that the most biologically relevant changes in carbonate chemistry in the Salish Sea since pre-industrial times are driven on seasonal time scales. Since the seasonal conditions are spatially dependent on the  $\Omega_{ar}$  status, the interpretation of seasonal  $\Omega_{ar}$  projections suggest that time-sensitive biological processes (spring and autumn spawning, spring growth) will be most affected. Habitats currently with the lowest OA baseline conditions (the greatest exposure) and those that are rapidly changing due to anthropogenic drivers will likely be the most affected. Based on seasonal exposure outputs, all of the species are exposed to unfavorable conditions below the thresholds for a considerable amount of time and, as such, important processes during various life stages can be impacted. However, while organisms in the regions currently characterized by low

OA exposure could potentially have some time to adapt, that is not the case in the rapidly changing habitats (especially in the small inlets of the South Sound; Figure 9D), where the lack of available time for adaptation could impose the most detrimental ecological changes. This is an important distinction to consider when evaluating future habitat suitability.

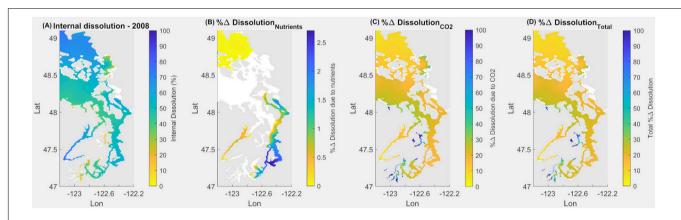
Intense anthropogenic acidification is rapidly changing urban estuaries such as the Salish Sea, driving increased risk for pelagic calcifiers. Evans et al. (2019) quantitatively characterized future seasonal projections for the Salish Sea, finding that the process of acidification is predicted to non-linearly intensify in the future. In comparison, our study of future 2050 seasonal  $\Omega_{\rm ar}$  projections of habitat suitability in the Puget Sound shows that future suitable conditions are predominantly dependent on the vertical extent of habitat considered. The vertical averaging of 0–100 m renders substantially faster exponential declines with no suitable habitat available (**Figure 10B**) compared to only surface waters with some extent of suitable conditions (Evans et al., 2019).

# Caveats and Strengths of Using Biological Thresholds

The application of thresholds in the biogeochemical model to deduce the attribution of anthropogenic stressors in the estuarine system is a simplified approach for predicting changes in OA exposure related to potential habitat of marine calcifiers.



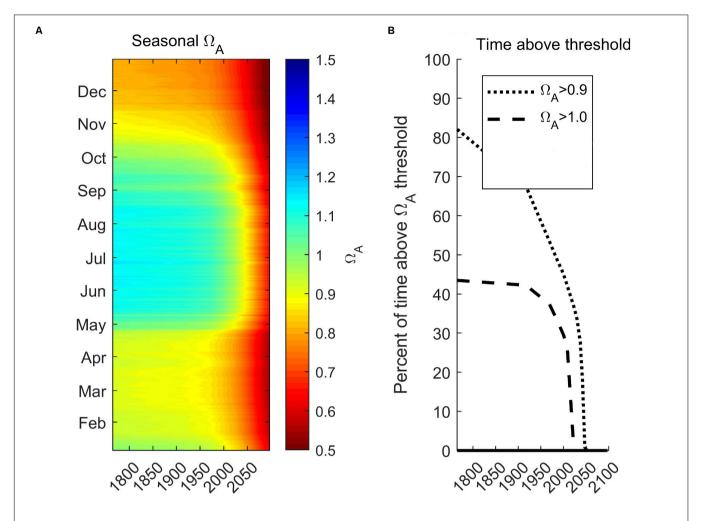
**FIGURE 8** | Application of pteropod threshold for survival in the upper 100 m (14 days at  $\Omega_{ar}=0.95$ ) over the annual scale in the Salish Sea. Model outputs demonstrate current duration, intensity, and severity of the conditions (**A,G,M**). The second column indicates all the changes due to nutrients (**B,H,N**); the third column depicts the changes due to atmospheric CO<sub>2</sub> (**C,I,O**), the fourth column (**D,J,P**) shows total changes due to both nutrients and atmospheric CO<sub>2</sub>. The fifth column (**E,K,Q**) depicts % changes in  $\Omega_{ar}$  due to nutrients, and the sixth column (**F,L,R**) is % change in  $\Omega_{ar}$  due to atmospheric CO<sub>2</sub>. Values of zero are masked in white.



**FIGURE 9** | Application of equation for larval Dungeness crab dissolution over upper 160 m integrated water depth for May–June in the Salish Sea to demonstrate current (2008) state of internal dissolution in % (A); % change of dissolution due to nutrients (B); due to atmospheric CO<sub>2</sub> (C); and combined % change due to both nutrients and atmospheric CO<sub>2</sub> (D).

While it does not take complex variability in exposure regime or co-occurring multiple stressors into account, here we have used it to identify spatial and temporal anthropogenic OA hotspots in the ecosystem. Biological thresholds are further characterized by different levels of confidence scores, with the lowest confidence implying greater uncertainty in interpretations of the biological responses. Applying thresholds

only over time periods when biological processes occur, however, ensures that temporal exposure below the threshold are correctly interpreted within the context of species life history. Furthermore, comparing the sensitivity of thresholds that were derived either from experimental or synthesis studies can yield different results and, thus, interpretation of different species risks and sensitivities.



**FIGURE 10** | Future seasonal projections of vertically integrated (0–100 m)  $\Omega_{ar}$  at the station P28 in the Main Basin under RCP 8.5 scenario for the year 2100 **(A)** and projected time above pteropod thresholds for sublethal ( $\Omega_{ar}$  of 1.0) and lethal ( $\Omega_{ar}$  of 0.9; **B**).

The impact of anthropogenic stressors in the Salish Sea currently results in exposures that induce a variety of negative sublethal responses, such as mild dissolution and growth impairments, but those risks vary spatially and temporally. The greatest magnitude change in  $\Omega_{ar}$  during the spring transition is associated with the time of spawning and most intense growth, implying a potential temporal mismatch between the early life stages and less favorable habitats. Furthermore, there are other sublethal thresholds that have been identified for pteropods, such as severe dissolution, and reduced calcification and reproductive efforts (Bednaršek et al., 2019). Given the similarity in the magnitude and duration of these thresholds, the current OA exposure regime, either seasonally or on annual basis, is below multiple thresholds. This means that current exposure can affect multiple pathways of physiological sensitivity and can cumulatively contribute to a greater impact than only predicted based on one pathway. It is difficult to extrapolate exposure to mortality thresholds on the population dynamics in the Salish Sea. Since the intensity of exposure associated with mortality thresholds is currently still very limited spatially, we can only

infer that any potential population-level decline would be a result of prolonged impairments on the organismal level, with the trends outside the variability envelope taking significantly longer to be demonstrated.

Comparisons of different thresholds for various marine calcifiers and their life stages confirm similar magnitude of sublethal thresholds for various oysters and mussels, ranging from 1.4 to 1.8 (Gaylord et al., 2011; Barton et al., 2012). With respect to the larval lethal threshold at  $\Omega_{ar}=1.2$  (Waldbusser et al., 2015), pteropod mortality threshold is less sensitive, thus providing a more conservative estimate of  $\Omega_{ar}$  impacts. Nevertheless, since none of these studies provide a threshold duration, the risk estimates for these species cannot be assessed in a manner similar to this study, urging future experimental studies to derive all elements (magnitude and duration) needed for risk assessment.

### **Uncertainty of the Projections**

Model projections of OA exposure below biologically relevant thresholds include uncertainty from several sources: model

uncertainty (including parameter and structural uncertainty), scenario uncertainty, potential changes in hydrodynamics, and threshold uncertainty (Bednaršek et al., 2019). Scenario uncertainty is likely to be the most important factor for longterm projections (Hawkins and Sutton, 2009) beyond the 2060s. In addition, OA co-occurs with warming and deoxygenation in the Salish Sea (Reum et al., 2014), and these interactions are not captured in these predictions, but the fast warming rates predicted in the Salish Sea (Hamel et al., 2015) may additionally exacerbate already compromised biological responses imposed by OA exposure. The uncertainty of the predicted  $\Omega_{ar, cal}$ , and pH from the Salish Sea model has been described using a variety of model skill metrics (Bianucci et al., 2018). Model skill estimates are based on the differences between predicted and observed conditions. By keeping hydrodynamics the same for all scenarios, we include the caveat that the differences between scenarios isolate the effects of only regional human nutrients and global anthropogenic CO2 while not taking future physical and hydrodynamics changes into account.

The sum of separately evaluated relative effects of anthropogenic  $CO_2$  and regional anthropogenic nutrient inputs as a percentage of the combined effects of  $CO_2$  and nutrients together does not necessarily equal 100%. This is partly because the effects were evaluated individually, and partly because these processes are not necessarily linear. In other words, the effect of added nutrient loading may differ depending on whether the effect of added  $CO_2$  is considered or not. The separate effects of nutrients and  $CO_2$  also may occur at different times. The effect of nutrients in some locations and seasons decreases the severity of adverse conditions, especially in the euphotic zone during the growing season, when added nutrients increase photosynthesis. In other locations and seasons, the effect of added nutrients increases the severity of adverse conditions, especially below the euphotic zone.

# Validation Between the Observation and Synthesis Studies

Since this is the first study that evaluates the risks related to anthropogenic OA using biogeochemical scenarios, it is difficult to ascribe the significance of the study's model outputs or compare it to any previous work. Evaluations should always be considered in comparative terms. In an effort to interpret observed increases related to the sublethal and lethal effects in the model, it is clear that we cannot evaluate the absolute numbers and conclude what this means for the organisms or populations, although the magnitude change of 0.16 to 0.12  $\Omega_{\rm ar}$  unit appears large. The available experimental and field data can, however, be used to reflect and possibly validate the magnitude increases observed in the model outputs.

Comparisons with the food web model outputs and food web modeling conducted in the Salish Sea and the West Coast, respectively (Busch et al., 2013; Busch and McElhany, 2016; Marshall et al., 2017), delineate the most sensitive species, i.e., pteropods and Dungeness crabs. Furthermore, the experimental work by Busch et al. (2014) confirmed pteropod sensitivity to OA through increased shell dissolution and mortality. This finding

has been recently confirmed in a field study by Bednaršek et al. (unpublished) that delineates spatial distribution of pteropod shell dissolution in the Salish Sea. The latter work locates the most severe exposure to be in the Hood Canal and Whidbey Island in the late summer, and to a minor extent in the inlets of the South Sound. Such spatial designation of OA hotspots aligns explicitly with the findings of this study despite using a completely different approach, i.e., applying shell dissolution thresholds in the biogeochemical model. Given that the sublethal threshold of mild dissolution is characterized by a high confidence score, the biological interpretation of the induced sublethal effects is more certain. The agreement between the field and biogeochemical approaches of spatial and temporal exposure inducing risk offers some validity to the SSM modeling.

Furthermore, the survival threshold derived from experimental studies on pteropods from the Salish Sea is below  $\Omega_{ar} = 0.56$  (Busch et al., 2014). Despite a difference between the experimentally derived threshold ( $\Omega_{ar} = 0.56$ ) and the one based on expert-based consensus ( $\Omega_{ar}$  = 0.95) used in this study, our model outputs demonstrate that there are areas in the Salish Sea with the exposure to the lower, experimentally derived thresholds. As such, expert-based thresholds are much more sensitive in their value compared to experimental ones, with this approach being more precautionary than the experimentally derived thresholds when used to delineate areas of increased pteropod mortality. However, since the confidence score related to interpretation of the mortality threshold is low (Bednaršek et al., 2019), a more scrutinized and careful interpretation is warranted.

The sensitivity of larval Dungeness crabs relies on the estimates of internal dissolution, the extent of which is associated with increased energetic demand (Hans et al., 2014; Bednaršek et al., 2020). We identified the exposure inducive to increased internal dissolution to be spatially limited to the inlets and bays of the South Sound, where the risks are the greatest. Based on the data from Washington Department of Fish and Wildlife (Bosley, Katelyn; Washington Department of Fish and Wildlife, personal communication), the largest megalopae abundances correspond to stations P8, P28, and P4, where the carbonate chemistry conditions are most favorable, while some of the stations with the lowest recorded data are at the Hood Canal (station P402) and South Sound (P38), characterized by the lowest carbonate chemistry conditions. Importantly, time series from the same area identify Dungeness crab population declines over the last years, illustrating some parallels between the model outputs and field observations. Although the drivers behind the population decline in the South Sound have not been identified yet, we emphasize anthropogenic OA must be taken into account. Field data for Dungeness crab internal dissolution are limited to the Pacific Northwest coast (Bednaršek et al., 2020) and are not specific to the Salish Sea. As such, direct comparison of the results related to the spatial or temporal exposure is not feasible. Nevertheless, the greatest extent of internal dissolution is found at the lowest  $\Omega_{cal}$  (Bednaršek et al., 2020), which is also observed in the biogeochemical model outputs. Despite the absence of additional sensitivity tools (e.g., thresholds) in the model, our

approach still validates the use of the sensitivity equation in the SSM to identify the spatially relevant exposures associated with increased risks for larval Dungeness crab.

In conclusion, these observations, experimental results, and model output largely confirm the validity of the use of thresholds to detect risks of anthropogenic OA exposures inducive of sublethal and lethal responses. As a result, we propose that thresholds be used to detect changes in exposure in comparison with pre-industrial times, which is something that cannot be achieved using the results of the meta-analyses, experimental, or synthesis work that are based on future conditions. In addition, thresholds' applicability can resolve the changes in the magnitude and duration of exposure attributable to specific anthropogenic stressors. This can ultimately provide new research venues to translate threshold species-specific model outputs to habitat suitability modeling efforts.

### Implications for Management

Overall, our results provide a set of scenarios that set the stage to evaluate current biological risks related to anthropogenic OA in the estuarine habitats of the Salish Sea for ecologically and economically important species. We demonstrate that atmospheric CO2 emissions are a major driver behind the modeled changes and responses, the reduction of which can help sustain biological species vital for ecosystem functions and society. In contrast, nutrient-driven eutrophication plays only a marginal role over spatially and temporally limited scales. Our results provide an initial step toward the development of management actions related to OA in the Salish Sea that focus on mitigation strategies to reduce atmospheric CO<sub>2</sub> emissions. However, in the absence of regional and locally supported actions for lowering CO<sub>2</sub>, other resilient strategies that buffer against OA, such as kelp and seaweed farming, may be effective on a local or regional scale.

### DATA AVAILABILITY STATEMENT

The the NetCDF model outputs supporting the conclusions of this article will be made available by the authors, without undue reservation, to any qualified researcher.

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### **AUTHOR CONTRIBUTIONS**

NB, GP, and RF conceptualized the research and design of the study. NB wrote the proposal and obtained the funding for this work through the SeaDoc Society, provided biological interpretation, and wrote the first draft of the manuscript. GP and AA conducted the modeling work. GP performed the statistical analyses. RF contributed with the observation-model comparisons. All authors contributed to manuscript revisions, read and approved the submitted version.

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- **Conflict of Interest:** The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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