1	Title: Bering Sea Marine Heatwaves: Patterns, Trends and Connections with the Arctic
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#### Abstract 20

21 The conterminous marine system of the Bering Sea serves as an important connection between the Pacific and the Arctic. Surface water temperatures of the Northern Pacific have 22 been rising over the past decades with associated changes in extremes: marine heatwaves 23 (MHWs). This study aims to explore the spatiotemporal evolution characteristics and 24 occurrence mechanisms of MHWs in the Bering Sea. Our findings reveal that MHW metrics 25 26 are above average in most parts of the Bering Sea, with the number of days being more than 50 a year. Frequencies of MHWs are relatively high in the western sectors while durations 27 and intensities are high in the eastern and southern sectors of the Bering Sea. Increasing 28 29 trends in the MHW days are noticed almost everywhere while similar increases in MHW intensities are found in the northern Bering Sea. In addition, Chukchi Sea ice concentrations 30 31 show a negative correlation with heatwave frequencies and days while the Arctic Oscillation 32 has no significant connection. Positive correlations are observed between Chukchi sea temperatures and Alaskan air temperatures, implying influences on the MHW frequencies 33 34 and days. While the annual trends in the MHW frequencies and days peak over several periods, the latest decade (2010–2019) has seen the highest of both. Our findings suggest that 35 the spatiotemporal distribution of MHW metrics is connected with underlying physical 36 37 processes in the Bering Sea and neighbouring climatic patterns such as the Pacific teleconnections, sea ice extent, air temperature, and its location within the Arctic. 38

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40 Keywords: Bering Sea; Marine Heatwave; Arctic; Climate Variability; Temperature

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## 43 **1. Introduction**

44 Anthropogenic warming and its consequent climate impacts have been promulgated in recent studies attracting global attention in climate sciences. With continuous research on 45 increasing temperatures, drought frequencies and incessant weather spells, extreme events 46 have become an important subject in climate change research (Jentsch et al., 2007; Wang and 47 Zhu, 2020). One category of extreme events, known as 'heatwaves', has been receiving great 48 49 attention over the years. Heatwaves are defined as the periods of abnormally hot weather conditions, which have been increasing in frequency and intensity, hampering human health 50 and ecosystems in the recent decades. A similar phenomenon, called 'marine heatwaves' 51 52 (MHW), has been known to occur in oceans, threatening marine ecosystems and productivity (Selig et al., 2010; Frölicher and Laufkötter, 2018; Smale et al., 2019). This term has also 53 seen updated definitions based on statistical properties and other metrics (Meehl and Tebaldi, 54 55 2004; Fischer et al., 2011; Perkins and Alexander, 2013). The latest definition describes MHWs as discrete periods of anomalously warm sea surface temperatures, ranging for days 56 57 to months and can extend up to thousands of kilometres (Hobday et al., 2016). Notable MHWs have occurred in the Mediterranean Sea (Sparnocchia et al., 2006; Olita et al., 2007), 58 in the Tasman Sea off the coast of Australia (Oliver et al., 2017), in the northwest Atlantic 59 60 Ocean in 2012 (Mills et al., 2013) and in the North Pacific including the recent "Blob" (Bond et al., 2015; Scannell et al., 2016). 61

Even with substantial knowledge of global SST changes, an investigation of previous
occurrences of MHWs and associated climate processes are still lacking (Frölicher and
Laufkötter, 2018). In addition, there is still an ongoing debate on recent Arctic changes in
influencing broader hemispheric weather patterns (Francis, 2017; Kretschmer et al., 2018).
Previous studies have indicated that large-scale circulation patterns in the Northern
Hemisphere are, in some degree, influenced by Arctic amplification (Francis and Vavrus,

2012). On the contrary, there are other studies highlighting an insignificant relationship
between Arctic warming and circulation patterns (and waviness) in mid-latitudes where most
of the changes occur due to internal variability or thermodynamic effects in particular seasons
(Screen, 2014; Blackport and Screen, 2020).

The percentage of sea surface temperature (SST) change is the highest in the high latitudes of the Northern Hemisphere for near-term and future long-term scenarios (Ruela et al., 2020). Such changes occur due to the inter-decadal variability of upper ocean temperatures which are more prominent in the higher northern latitudes as compared to the Tropical oceans (Wang et al., 2010). With marine ecosystems being vulnerable to the consequences of MHWs, there is a need to assess the extent and prevalence of MHWs on regional scales.

79 The Bering Sea, among other oceans in the Northern Hemisphere is expected to have higher changes in SSTs in the near future (Ruela et al., 2020). The Bering Sea and Chukchi 80 81 Sea of the Arctic are known to have similar patterns in ocean-atmospheric warming and have 82 been linked to ocean currents and teleconnections of the Pacific (Carvalho and Wang, 2020). Climate variability in the Bering Sea is largely heterogeneous and is influenced not only by 83 seasonal patterns, but also by sea-ice changes, air temperature and other meteorological 84 85 components which are sensitive to the Arctic cryosphere (Wood et al., 2015). The Pacific Arctic region which encompasses the Bering-Chukchi complex has been linked with ocean 86 87 heat transport and inflows via the Bering Strait influencing Arctic sea ice and global hydrological circulations (Woodgate et al., 2012). In addition, the anomalous conditions in 88 89 the Bering Sea (1997-1998), studied by Yeo et al. (2014) indicates no significant relationship of SST, sea ice and energy flux between the Bering and Chukchi Seas. Nevertheless, there is 90 91 still a lack of studies revolving around extreme climates in the Bering Sea. Hence, a more in-

92 depth outlook is desired to explore the occurrence of MHWs and associated air-sea93 interactions with the Arctic.

Here, we will investigate different statistical properties including duration, frequency 94 95 and intensity of MHWs since the late 1990s on spatial and temporal scales. Furthermore, the recorded MHWs over the time period (1990–2019) will be investigated with other climatic 96 variables in the adjoining high latitudes. The MHW annual frequencies and days will be 97 98 correlated with various variables to decipher possible connections or drivers of MHWs in the Bering Sea (details provided in Section 2.2). Therefore, the objective of this study is to 99 explore the spatiotemporal evolution characteristics and occurrence mechanisms of MHWs in 100 101 the Bering Sea.

102 This paper will be organized as follows: Section 2 will introduce data sources and 103 methods involved in exploring MHW characteristics and occurrence mechanisms; Section 3 104 presents an in-depth analysis of MHW metrics on spatio-temporal scales; Section 4 provides 105 a thorough discussion on the Bering Sea MHW variations and connections with the Arctic 106 climate; Section 5 summarizes the main conclusions drawn from this study.

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## 108 **2. Data and Methods**

# 109 2.1. Data sources

The standard MHW definition is applied to the National Oceanic and Atmospheric
Administration (NOAA) Optimum Interpolation (OI) SST V2 (and V 2.1, available for 2016
onwards) high resolution (1/4°) gridded SST data for the period 1982 to 2019. The time
period for studying MHW statistics in the Bering Sea is from 1990 to 2019 (Figure 1). The
Bering Sea is bounded by Russia on the north and west, Alaska in the east and the Aleutian

115 Islands in the south. The Bering Sea occupies a geographic location which is susceptible to various oscillation patterns and seasonal extremes (Niebauer, 1988). It is constrained by 116 latitudes 160°E-150°W and longitudes 53°N-60°N. The daily OISST data is constructed by 117 combining observations from various platforms (satellites, ships and floats) and interpolated 118 on a global grid (Reynolds et al., 2007). The analysis data contains in-situ data as well as the 119 large-scale adjustment and corrections of satellite biases. The new version (V2.1) contains 120 121 additional significant improvements in Arctic observations as well (Arctic buoys, SST improvements as a function of sea ice) (Banzon et al., 2020). The MHW analysis will be 122 123 applied to the Bering Sea, providing a more comprehensive outlook of extremes in the midhigh latitudinal sea. (Figure 1). 124

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# 126 **2.2. Marine heatwave metrics**

A marine heatwave is defined as a "discrete and prolonged anomalously warm water 127 event" and is identified from daily SST time series. Each of the terms "discrete", "prolonged" 128 and "anomalously warm" has been qualitatively described in a marine context (Hobday et al., 129 2016). Explicitly, "discrete" implies an MHW event with distinct start and end dates, 130 "prolonged" represents a clear MHW count which means a persistence of the event for five 131 consecutive days, and "anomalously warm" indicates that the water temperature is above a 132 climatological threshold (defined as the 90<sup>th</sup> percentile threshold). Hence the climatological 133 threshold is from 1982 to 2012 which is the acceptable time period for determining the 134 135 threshold (a minimum of 30 years) according to Hobday et al. (2016). The climatological mean and the 90<sup>th</sup> percentile threshold can be calculated for each day of the year using daily 136 137 temperatures across all years in each grid. The climatological threshold, once obtained, can be used in the detection of warm and cold spells. Such definitions have also been 138

implemented in software tools such as R (https://github.com/cran/RmarineHeatWaves) and
Matlab (https://github.com/ZijieZhaoMMHW/m\_mhw1.0). Therefore, MHWs are identified
as periods that are above a threshold for at least five consecutive days, and gaps between
events of two or less days with a subsequent five day or more MHW events are also
considered as continuous events. .

An MHW can be identified at any point in the ocean from the gridded dataset with the 144 aid of a hierarchical set of metrics (Table 1). Metrics including duration and intensity 145 (collectively termed as primary metrics) can be calculated. These properties are defined as 146 follows: "duration" is the time period between a given start and end date, "maximum 147 intensity" is the maximum temperature recorded relative to a climatological threshold over 148 the duration of the respective event, and "cumulative intensity" is the sum of temperature 149 anomalies for the duration of the event. "Mean intensity" is the mean anomalous temperature 150 151 for the given MHW event. Mean states and trends can also be calculated for each MHW property. "Frequency" is the event counts in each year, and "days" are referred to as the sum 152 of MHW days in each year. Annual time series can be calculated on temporal scales for each 153 154 MHW metric.

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# 165 **2.3. Correlation analysis**

166 To understand the Bering Sea-Arctic connections, statistical analyses of MHWs will be carried out. Climate variables will be correlated with the annual frequency and the annual 167 number of days (MHW days) recorded in the Bering Sea. The annual MHW frequencies and 168 days are calculated by averaging the respective values over the entire grid area of the Bering 169 Sea, thereby including MHW events on different spatial scales. The resultant temporal 170 171 variations are correlated with the following variables: Sea Surface Temperature (SST) and Sea Ice Concentration (SIC) of the Chukchi Sea, Alaskan and Russian Arctic Air 172 Temperatures, the teleconnection pattern, and the Arctic Oscillation (AO). Here, the Russian 173 Arctic is the geographical region of Russia north of 65°N while Alaska is the region in the 174 pan-Arctic containing 13 climate divisions based on vegetation types, climate and extreme 175 events (Bieniek et al., 2011; Smith et al., 2014). The Chukchi Sea SST and SIC data were 176 extracted from the same NOAA OI dataset used to examine MHWs in the Bering Sea. The 177 Air Temperature (AT) data was obtained from the ERA5 dataset which can be accessed 178 179 through the C3S Climate Data Store (CDS).

180 The ERA5 dataset contains the latest significant improvements over its predecessors 181 (Hersbach et al., 2020). In particular, energy budgets, fluxes and higher resolution data make 182 the dataset useful for the study (Mayer et al., 2019). Estimates of ocean heat budgets in the 183 ERA5 dataset are good on an annual mean basis, and the improved measurements of air

temperatures by radiosonde and other sounding techniques have proved that the dataset has
significant improvements on its former predecessors (Ingleby et al., 2016; Hersbach et al.,
2020). The AO data was downloaded from the NOAA Climate Prediction Center
(https://www.cpc.ncep.noaa.gov/). To be consistent with the observations and trends, the
linear trends were removed before calculating the correlation coefficients.

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190 **3. Results** 

191 **3.1. MHW mean states and trends** 

The number of MHW days is a sum of 40-50 and is seen in most parts of the Bering 192 193 Sea (Figure 2a). The largest number is seen in the eastern Bering Sea and along the coasts of Bristol Bay in Alaska at approximately 58 MHW days. The smallest sum of 22 MHW days is 194 seen along the coasts of Kamchatka Peninsula in Russia. The MHW frequencies show a 195 196 wider range of values across the Bering Sea (Figure 2b). The map shows a higher number of MHW events in the western Bering Sea and Bering Strait. Moreover, 3 or more MHW events 197 are found to occur in the regions of lower bathymetric depths in the Bering Sea. In 198 comparison, lesser number of MHW events is observed in the eastern sectors of the sea. Long 199 MHW durations are seen in the eastern Bering Sea at 25 days (Figure 2c), whereas most of 200 the Bering Sea region shows an average of 15–20 days. The MHW mean intensities show a 201 notable dipolar spatial pattern (Figure 2d). The MHW mean intensities of 1.8°C are seen in 202 the north with smaller variations along the bordering regions of East Russia and Alaska, and 203 204 the lower values of 1–1.2°C are seen in the southern sectors of the Bering Sea. The MHW maximum intensities show a similar spatial distribution as mean intensities but with relatively 205 206 higher values (Figure 2e). Maximum MHW intensities appear in the north, ranging between 2.4–2.7°C while the southern sectors of the Bering Sea are at values between 1.2–1.4 °C. 207

208	Cumulative MHW intensities ranging from 50 to 65 °C days are seen in the eastern Bering
209	Sea (Figure 2f). Other regions show lower values of 15–20 °C days.
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215	Significant positive trends in MHW days are found across the entire area of the

216 Bering Sea (Figure 3a). The highest decadal trends are found along the central and eastern 217 sectors at 44 days/decade. A few regions in the central Bering Sea show comparatively larger values of 55-60 MHW days/decade. Increasing trends in MHW frequencies are also observed 218 219 along the entire Bering Sea region except for the parts near the Aleutian Islands (Figure 3b). Comparatively higher trends of 2–3 MHW events/decade are observed in the west and along 220 the coasts of the Russian Far East. Lower number of 1 MHW event per decade are seen in the 221 Bering Strait and southern Bering Sea. Moreover, significant trends in MHW durations are 222 noticed in most of the region except for the coastal areas near the Kamchatka Peninsula 223 224 (Figure 3c). Longer periods of MHWs are seen in the eastern Bering Sea near the coasts of Aleutian Islands and Bristol Bay (Alaska). Significant trends in MHW mean intensities are 225 noticed in the eastern Bering Sea (0.33 °C) and the Bering Strait (0.55 °C) (Figure 3d). 226 Similar spatiotemporal trends are seen in maximum MHW intensities (Figure 3e). Higher 227 values of 0.7–0.8°C/decade are observed in the north while the remaining sector shows lower 228 values of 0.3–0.45 °C/decade. Cumulative MHW intensities are significantly higher in the 229

230	coastal regions of southern Alaska with values ranging between $35 - 40$ °C days/decade
231	(Figure 3f).
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237	3.2. Interrelationships between MHW characteristics and climate variables
238	Two MHW characteristics, namely MHW frequency and MHW days, are correlated
239	to understand the connections between extreme marine events and regional climate factors.
240	MHW frequencies have been increasing at the rate of 3 events per year for the time period
241	1990–2019 (Figure 4). Furthermore, the recent decade (2010–2019) shows the highest mean
242	count of 4 while the first decade (1990–1999) shows the lowest mean count of 2. The highest
243	MHW frequency is observed in 2017 at 7 MHW events. The MHW days have also been
244	increasing at the rate of 3.92 (4 MHW days) per year for the same time period (Figure 4).
245	While the recent decade (2010–2019) shows the highest mean MHW days of 93, the lowest
246	number is seen in the first decade (1990–1999) at 21 mean MHW days. The largest number
247	of MHW days was 172 days in 2018. Here we take into account the average of all MHWs
248	that occur in the entire gridded dataset covering the Bering Sea region where "MHW days"
249	refer to the total number of days in each year. We also find that in the first decade (1990-
250	1999), MHW frequencies and days are at record highs in 1997, which is the same year a
251	recorded MHW with maximum intensity of 5.1 °C, anomalously high atmospheric pressures
252	near the eastern Bering Sea (particularly the Alaskan region) and seasonal changes in

253	atmospheric circulation patterns in response to the El Niño impact on the ecosystems and				
254	climate regimes of the Bering Sea (Napp and Hunt, 2001). MHW frequencies and days				
255	(Figure 4) show a triple peaked pattern for the period of 30 years where each decade shows a				
256	bell-shaped pattern. It is interesting to note that these patterns (particularly 2000-2005 and				
257	2007–2010) approximately reflect warm and cold events recorded in the eastern Bering Sea.				
258	Previous study has recorded warm and cold events in the southern Bering Sea compiling data				
259	from St. Pauls island (Alaska) for the periods 2001–2005 (warm) and 2007–2010 (cold)				
260	(Overland et al., 2012). Based on the climate record of six-year warm events followed by				
261	four-year cold events, the MHW frequencies tend to follow a similar temporal distribution.				
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267	Pearson correlation coefficients (r) were estimated to explore the underlying				
268	interrelationships between MHW characteristics (frequency and days) and climate variables				
269	(Table 2). Three of the climate variables, including Chukchi Sea SST/SIC and Alaska AT,				
270	show significant correlations (p-value less than 0.05) with both the MHW frequency and				
271	days; the other variables i.e. the Russian Arctic AT and AO do not show a significant				
272	correlation with either the MHW frequency or days.				
272	In particular, Chukabi Saa SST shows an aqually strong positive correlation, with				
273	similar resoluce when correlated with the MUW for more training 0.70) and MUW h				
2/4	similar r values when correlated with the MHW frequency ( $r = 0.70$ ) and MHW days ( $r =$				
275	0.68). Seasonal behaviour is also depicted with positive correlations in the summers and				

276 winters. The Chukchi Sea SIC is the only climate variable showing a significant negative correlation with MHW frequencies (r = -0.67) and MHW days (r = -0.60). This indicates that 277 the years with lower Chukchi Sea SIC witness more MHW events. The same is also true for 278 279 MHW days. The Chukchi Sea SIC shows winter patterns with MHW frequencies (r = -0.55) and MHW days (r = -0.64), and shares a summer connection with only MHW frequencies. 280 The correlation between Chukchi Sea SIC and MHW days in the winters is low (r = -0.30). 281 Alaska AT shows a similar strength of correlation with the MHW frequency (r = 0.68) as 282 Chukchi Sea SIC and SST, but shows a higher level of correlation (r = 0.74) with MHW 283 284 days. This pattern is corroborated by Figure 2a which shows the largest number of MHW days close to the Alaskan Peninsula. There is a strong display of seasonal behaviour as well 285 with significant correlations above 0.50. This seasonal behaviour can be attributed to the 286 287 influence of the Aleutian Low pressure patterns, the North Pacific Oscillation (NPO) and the 288 North Pacific Gyre Oscillation (NPGO). Previous studies have highlighted the variability in the Aleutian Low and NPO-NPGO coupling in response to winter SSTs in the north-eastern 289 290 Pacific (Rodionov et al., 2007; Danielson et al., 2011). The Russian Arctic AT has no significant correlation with neither MHW frequency (r = 0.23) nor with MHW days (r =291 0.21). A similar case can be made for the AO as well. Furthermore, the seasonally averaged 292 AO also does not show significant correlations with MHW frequencies and MHW days. 293 294

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296 Place Table 2 here

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#### 299 **4. Discussion**

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# 4.1. Bering Sea MHW metrics and variability

In this study, the Bering Sea marine heatwave variability was examined on spatial and 301 temporal scales. To better understand the air-sea interactions, the MHW metrics were also 302 correlated with Arctic climate variables. MHW days are fairly equally-distributed throughout 303 304 the Bering Sea although there is a larger average number of MHW days observed off the western coast of Alaska, with the number decreasing towards the south-west of the Bering 305 306 Sea. Furthermore, certain areas such as the coasts of the Aleutian Islands and parts of central Bering Sea have a larger number of 58 days. Moreover, the southern coast of Alaska, Bristol 307 Bay and the Aleutian Islands witness the largest number of MHW days (approximately 60–62 308 days). This is due to higher temperatures in southern Alaska as compared further north. In 309 310 addition, air temperatures along the southern Alaskan coasts have been well correlated with teleconnections particularly the Pacific Decadal Oscillation (PDO) (Bieniek et al., 2011). 311 312 This manifests that coastal MHW days-air temperature interactions are stronger and 313 dependent on the PDO in the eastern Bering Sea. MHW frequencies are lower in the east and higher in the western Bering Sea. The east coast of the Russian Far East has a higher number 314 of annual events (greater than 3) than the Alaskan coastline. Such spatial patterns exemplify 315 316 the studies where MHW frequencies are greatly enhanced by SST re-emergence patterns associated with the thermocline circulation (Scannell et al., 2016). 317

An interesting observation can be made between the spatial distribution of MHW frequencies and durations. Here we find longer MHW durations and lower frequencies in the east Bering Sea, while the opposite is seen in the western sector. We reiterate that the MHW duration refers to the consecutive time period where the temperature exceeds the 90<sup>th</sup> percentile threshold. The spatial patterns observed in Figures 2a and 2c show higher number

323 of MHW days and durations near the southern coasts of Alaska. This is due to the SST variability that exists in the Northern Pacific where higher SST anomalies are seen in the 324 Eastern Bering Sea and further south along the western American coastline. This means that 325 326 there are higher SSTs that persist for many days, implying a greater number of MHW days in this region. The spatiotemporal distribution of MHW mean and maximum intensities depicts 327 higher values in the north as compared to the southern Bering Sea. The northern Bering Sea 328 329 is generally characterised as having high-frequency dynamics and spatiotemporal variability as compared with the southern counterpart which shows gradual cold-to-warm transitions 330 331 (Baker et al., 2020). While the Bering Sea shows relatively low MHW cumulative intensities, the regions off the western coasts of Alaska have higher values (greater than 45 °C days). 332

An interesting spatial pattern to note is the high MHW metrics (except frequencies) 333 observed in the Eastern Bering Sea (and particularly near southern Alaska). A possibility 334 335 does arise where the Aleutian Low in southern Alaska may be contributing to seasonal variability and trends in MHW metrics in the Bering Sea. A common spatial feature observed 336 337 in all panels of Figure 2 is that the region of the Bering Sea south of 58° shows less MHW days and mean intensities. On the contrary, there is a greater number of MHW days, longer 338 339 durations and higher intensities in the east and further north. From this perspective, the 340 southern coasts of Alaska experience longer MHWs with higher intensities as compared to other regions in the Bering Sea. Such spatial characteristics can be influenced by North 341 Pacific circulation patterns which have often dictated spatial trends in SSTs and seasonal 342 343 teleconnections. The SST over the North Pacific bears similar resemblances to the higher latitudes (particularly Gulf of Alaska and the nearby south eastern Bering Sea region) (Yeo et 344 al., 2014). Such resemblances have been attributed to the NPO which exerts a strong 345 influence on the temperatures over central and north east Pacific Ocean. Therefore, the 346 variability in MHW occurrences and intensities in the south eastern Being Sea are possibly 347

348 driven by the NPO which in turn influences the oceanic NPGO of the Pacific Ocean. Furthermore, the coastal region of the Kamchatka Peninsula (Russia) experiences more 349 frequent MHWs of very short durations as compared with other regions. Such shorter-350 351 duration MHWs may be due to a smaller influence of NPO and climate variability in the Pacific, although further studies are suggested in this aspect. Another explanation for the 352 higher MHW metrics in the eastern Bering Sea is due to positive phases of the PDO, which 353 354 consequently lead to warmer SSTs in the eastern Bering Sea and colder than normal temperatures in the west. Hence such teleconnections can act as potential drivers of longer 355 356 and higher intensity MHWs in this region. Lastly, high surface heat fluxes and southeastnorthwest advection currents have been linked with air temperatures and heat content in the 357 central and southern sectors of the Bering Sea (Danielson et al., 2011). Therefore, our 358 359 findings confirm the south-eastern Bering Sea as an MHW hotspot or an important MHW locale. 360

Higher positive trends in MHW days occur in the eastern Bering Sea and along the 361 southern coasts of Alaska at greater than 50 days/decade. Similarly, positive trends in MHW 362 durations are noticed in the same regions at 25-30 days/decade, indicating longer periods of 363 MHWs. The trends in MHW frequencies are similar to mean states. A greater number of 364 365 events per decade is seen along the coasts of Russian Far East while a smaller number is seen in the southern coasts of Alaska. Trends in MHW intensities also approximately mirror each 366 other in spatial patterns. Significant mean, maximum and cumulative MHW intensity trends 367 are noticed in the eastern sectors of the Bering Sea (Figures 3e-f). These trends are reflective 368 of the mean SSTs in this region which are also considered as potential drivers of increasing 369 370 MHW trends.

#### 4.2. MHW temporal variations and connections with the Arctic climate

373 MHW events and annual days have been increasing since the 1990s with additional positive excursions also occurring throughout. Such positive excursions in MHW events 374 375 occurred in the years 1996-1997, 2003, 2015 and 2017, while those in MHW days occurred in 1996, 2003 and 2018-2019. Anomalously low MHW frequency and MHW days occurred 376 in 1999 and 2012 although there was a decreasing trend in the years preceding both of these 377 378 lows. In these multiyear periods with increasing MHW trends (such as 2000-2005 and 2014-2018), sea ice was at its minimum in the southern Bering shelves. Certain oceanographic 379 conditions can draw clues to the MHW metrics in the Bering Sea. The years from 2016 to 380 381 2019 show a lack of sea ice in the northern and south-eastern Bering Sea shelves and no cold pools in the summers. During the same years, we find a larger number of MHW days (mean 382 of 140 days) and MHW events (mean of 6 events). The years from 1990 to 2015 witness an 383 384 average of 44 annual MHW days and 4 MHW events. Therefore, warmer years serve as important signs and precursors for extreme ocean temperature anomalies. 385

386 Positive correlation in most of the climate variables indicate that MHW frequencies and the number of MHW days are greatly influenced by Arctic climate. The Chukchi Sea 387 SST with a high positive correlation hints that the Bering Sea heatwave frequencies and 388 number of days are strongly related to it. It implies that the Bering Sea MHW metrics may be 389 affected by interannual variability in the SST further north. The opposite is seen with ice 390 concentration in the adjoining sea. The Chukchi Sea SIC shows a negative correlation with 391 the MHW metrics, i.e. a decrease in sea ice can lead to more MHW days and greater counts 392 393 per year. The recent decades that show increasing MHW frequencies and the number of MHW days are attributed to the decreasing sea ice thickness, huge loss in sea ice and 394 reduction of ice cover in the Pacific Arctic. Climate simulations have hinted that the 395 396 reduction in ice concentration has further influenced cryosphere dynamics in the Pacific

397 Arctic region (Baker et al., 2020). Hence, this further implicates a decreasing Chukchi SIC with increasing MHW frequencies and days. Moreover, a high positive correlation with the 398 399 Alaskan AT proves that MHW annual counts and days in the Bering Sea are greatly 400 influenced by air temperatures in Alaska. Lastly, no significant correlation of MHW metrics with the Russian Arctic AT and AO states that these variables have negligible or no influence 401 on MHWs in the Bering Sea. It is worth mentioning the relationships between AO, Alaskan 402 403 AT and Bering Sea MHW metrics. While it is proven that AO is negatively correlated with Alaskan temperatures, the Bering Sea MHW frequency and annual days are not influenced by 404 405 AO, which brings a distinct characteristic to this relationship. The above results bring us to the important question: does the Arctic climate influence the neighbouring high latitude 406 circulation and atmospheric patterns? 407

Our study provides evidence supporting the theory that a connection is present 408 409 between Chukchi Sea SST, SIC and the Alaskan air temperatures on Bering Sea extremes marine heatwaves. Furthermore, the long-period analysis of this study provides a better 410 411 understanding of the relationship between the Bering Sea extremes and the Chukchi Sea and Alaskan climates. How is the theorised relationship defined? Our observations conclude that 412 413 the Chukchi Sea SST and Alaskan temperatures have a positive correlation with Bering Sea 414 MHW frequencies and annual MHW days, while the Chukchi SIC presents an inverse relationship with the aforementioned MHW metrics. In order to postulate a few theses, we 415 follow the hypothesis by Francis and Vavrus (2012) which states that Arctic amplification 416 417 and subsequent warming may cause persistent weather patterns and extreme weather in near mid-latitude environments. According to the Rossby wave theory, slower moving circulation 418 419 systems which are caused by reduced poleward gradients in the 1000-500 hPa thicknesses tend to weaken the upper-zonal flow. While sea ice loss and subsequent transfer of heat 420 energy from the ocean into the atmosphere are prominent in the autumn and winters, the 421

422 enhanced warming over Alaska leading to snow melt and heating of the Chukchi shelf is a common occurrence in the summers. Decrease in sea ice can also lead to greater ocean 423 temperatures due to the exposure of open waters. Such a prolongation of weather i.e. 424 425 increases in Chukchi sea temperatures, reduced sea ice loss and high Alaskan temperatures can account for extreme weather conditions - marine heatwaves in the Bering Sea. This 426 statement is supported by the anomalous warming event of 2015-2016 in the Bering Sea 427 428 which was caused by excessive heat content in the Gulf of Alaska and higher temperatures along the Alaskan coasts. 429

The slow-moving weather patterns can be caused by the enhanced 500-hPa ridging 430 431 (ridge elongation due to large increases in 500-hPa heights), and such patterns have also led to extreme weather and heatwaves across Europe in recent summers (Jaeger and Seneviratne, 432 2011). Questions arise from the above concluded relationship – Can the Chukchi Sea climate 433 434 alone lead to Bering Sea MHWs? Do the Alaskan air temperatures solely contribute to the Bering Sea MHWs? As shown in Table 2, it is evident that the Alaskan AT has higher r 435 values in correlation with the MHW metric. However, future development can bring about 436 more inferences from the same. Our theses can be summed up in the flowchart shown in 437 Figure 5. As mentioned previously, the correlations were performed after removing the linear 438 439 trends. Slightly higher r values can be found if the mean is removed. Also similar results can be obtained if the data is not detrended before the correlations are performed. 440

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# 446 5. Summary and Conclusions

This paper explores the spatiotemporal evolution characteristics and occurrence 447 mechanisms of MHWs in the Bering Sea with emphasis on different key metrics as defined 448 by Hobday et al. (2016). Different metrics are analysed on spatiotemporal scales, which 449 provides an in-depth analysis of geographic patterns of extremes in the Bering Sea. In 450 addition, MHW frequencies and the number of MHW days are correlated with different 451 climate variables, further disclosing the underlying connections between the air and sea 452 properties. In addition to examining relationships between MHWs and climate variables, this 453 paper offers a glimpse of Arctic cryosphere influences on neighbouring seas at lower 454 latitudes i.e. the Bering Sea. 455 456 While a number of studies in understanding marine extremes have been conducted in

the recent past, it is useful to note that the latest definition of MHWs has been used as a key
basis in this study. Further studies based on model experiments would be undertaken to fill in
the gaps existing in the marine heatwave knowledge, particularly on physical, ecological
impacts and geographical connections. Additional in-situ analyses and laboratory
experiments are also beneficial in understanding MHW impacts on ecosystems, communities,
and socioeconomic services.

463

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593	List of Figure Captions
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**Figure 4.** The MHW frequencies (blue bars) and annual MHW days (green bars) for the time

649 period 1990–2019.



**Figure 5.** Flowchart depicting a combination of Arctic variables that have an influence on the

660 Bering Sea MHWs. Here, an increase in Chukchi Sea SST and Alaskan AT coupled with a

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663	List of Table Captions
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666	Hobday et al. (2016).
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668	characteristics (frequency and days) and climate variables of the Arctic region. The
669	correlations with p-values less than 0.05 are statistically significant (see text for further
670	details).

- **Table 1**. Classification of marine heatwave (MHW) metrics, units and descriptions, after
- 673 Hobday et al. (2016).

Metric	Description	Unit
Duration	Time period between the start and end of MHW	days
Maximum Intensity	Maximum temperature anomaly that exceeds the threshold	°C
Mean Intensity	Mean temperature anomaly during the MHW event	°C
Cumulative Intensity	Integral of the temperature anomaly above the climatology	°C days

**Table 2.** Correlation statistics derived to reveal the interrelationships between MHW

677 characteristics (frequency and days) and climate variables of the Arctic region. The

678 correlations with p-values less than 0.05 are statistically significant (see text for further

679 details).

680

Climate Variable	MHW Frequency		MHW Days			
	Correlation coefficient (r)			Correlation coefficient (r)		
	Annual	Summer	Winter	Annual	Summer	Winter
Chukchi Sea SST	0.70	0.64	0.60	0.68	0.50	0.65
Chukchi Sea SIC	-0.67	-0.54	-0.55	-0.61	-0.30	-0.64
Alaska AT	0.68	0.65	0.58	0.75	0.64	0.58
Russian Arctic AT	0.23	-0.03	0.11	0.21	0.10	0.19
Arctic Oscillation (AO)	0.06	0.10	0.07	0.12	0.20	0.10

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