

1 **Dynamic and Thermodynamic Processes Related to Sea-Ice Surface**
2 **Melt Advance in the Laptev Sea and East Siberian Sea**

3

4 Hongjie LIANG,¹ Wen ZHOU^{1,2}

5 *¹ Department of Atmospheric and Oceanic Sciences & Institute of Atmospheric Sciences, Fudan*
6 *University, Shanghai, China*

7 *² Center for Polar Ice & Snow and Climate Change Research, Polar Research Institute of China,*
8 *Shanghai, China*

9

10

11 *Correspondence to: Wen Zhou (wen_zhou@fudan.edu.cn)*

12

13

14

15

Aug, 2023

16

17 ABSTRACT

18 Arctic summer sea ice has shrunk considerably in recent decades. This study
19 investigates springtime sea-ice surface melt onset in the Laptev Sea and East Siberian
20 Sea, which are key seas along the Northeast Passage. Instead of region-mean melt onset,
21 we define an index of Melt Advance, which is the areal percentage of a sea that has
22 experienced sea-ice surface melting before the end of May. Four representative
23 scenarios of Melt Advance in the region are identified. Each scenario is accompanied
24 by a combination of distinct patterns between atmospheric circulation, atmospheric
25 thermodynamic state, sea ice cover (polynya activity), and surface energy balance in
26 May. In general, concurrent with faster Melt Advance are warmer and wetter
27 atmosphere, less sea ice cover, and surface energy gains in spring. Melt Advance can
28 be potentially used in the practical seasonal prediction of summer sea ice cover. This
29 study implicates the interannual and interdecadal flexibility of spring circulation in the
30 lower troposphere and the significance of seasonal evolution in the Arctic.

31
32
33 **1. Introduction**

34 Since the 1970s, satellites have enabled global detection of the Earth. Arctic
35 summer sea ice extent is found to have decreased dramatically in the past four decades
36 (Petty et al., 2020; Stroeve and Notz, 2018), which is a prominent indicator of global
37 warming. In fact, the Arctic has a faster warming trend than elsewhere on the planet,
38 especially in the lower troposphere during the cold season(Cohen et al., 2014; Serreze
39 et al., 2009; Screen and Simmonds, 2010). This phenomenon, called Arctic
40 Amplification, presumably results from reduced sea ice cover and enhanced oceanic
41 energy release toward the atmosphere, atmospheric and oceanic heat transport from
42 lower latitudes, and local positive feedbacks (Serreze et al., 2009; Cohen et al., 2014;
43 Taylor et al., 2022). Some research has indicated that the mid-latitudes may frequently
44 experience severe winters due to the Arctic Amplification which reduces the meridional

45 temperature gradient and in turn amplifies the planetary Rossby wave and makes it
46 more stationary (Francis and Vavrus, 2015). In the Arctic, positive ice-albedo feedback
47 is active in the melt season (Budyko, 1969; Kashiwase et al., 2017; Sellers, 1969): after
48 sea ice begins to melt in spring, surface albedo decreases substantially, which favors
49 more solar radiation absorption and promotes further sea ice melting. Based on this
50 notion, some studies have tried to predict Arctic summer sea ice cover by sea-ice surface
51 Melt Onset (MO) in spring, i.e., the date when the sea ice surface begins to form liquid
52 water (Petty et al., 2017; Wang et al., 2011). Currently, satellite remote sensing helps
53 us construct the pan-Arctic sea ice MO, which is not possible with only in-situ field
54 observations. However, for sea ice lateral and bottom melting, satellites are less useful
55 and buoys are widely employed (Lei et al., 2022).

56 Many studies have touched on sea ice MO in springtime (Drobot and Anderson,
57 2001; Bliss and Anderson, 2014; Horvath et al., 2021; Crawford et al., 2018; Markus et
58 al., 2009; Stroeve et al., 2014). Generally, sea ice MO is becoming earlier in most parts
59 of the Arctic, which is consistent with the Arctic warming. Another notable feature of
60 MO is its regionality. For example, the Barents Sea, Kara Sea, Laptev Sea, and East
61 Siberian Sea are around the same latitudes along the Siberian coast, but the MO trends
62 were -7.1, -5.2, -2.8, and -1.8 days per decade from 1979 to 2013, respectively (Stroeve
63 et al., 2014). Liang and Su (2021) investigated the interannual early/late relationship of
64 MO between the Laptev Sea and East Siberian Sea, which is related to the large-scale
65 atmospheric pattern of the Barents Oscillation (Skeie, 2000). Locally, synoptic
66 processes are regarded as responsible for interannual variability. Mortin et al. (2016)
67 argued that sea ice MO is generally associated with higher surface air temperature
68 (SAT), total-column water vapor (TWV), and cloud cover, which promotes downward
69 longwave radiation.

70 The Laptev Sea (LS) and East Siberian Sea (ESS) are marginal seas of the Arctic
71 Ocean, north of Siberia along the Northeast Passage (Fig. S1). The longitude-latitude
72 ranges are around 70°N-80°N and 100°E-180°, covering 0.66 and 1.14 million km² for

73 the LS and ESS, respectively. These two seas are among the regions where sea ice
74 decline in September during the past four decades has been the most prominent, and
75 they are key regions for safe transportation across the Northeast Passage. In spring, sea
76 ice almost completely covers the seas, while in summer, sea ice substantially retreats
77 off the coast.

78 Focusing on the LS and ESS, which usually have the most persistent sea ice
79 coverage in the Northeast Passage, this study aims to demonstrate the springtime
80 processes related to different Melt Advance scenarios and explore the linkage between
81 springtime Melt Advance and summertime sea ice coverage.

82

83

84 **2. Data and Methods**

85 Sea ice Melt Onset (MO) is the date when the sea ice surface begins to melt in
86 spring, which is retrieved from satellite passive microwave signals (Markus et al., 2009).
87 Liquid water has greater emissivity than ice/snow, so surface melting invokes changes
88 in passive microwave signals. The dataset is distributed by the National Aeronautics
89 and Space Administration (NASA) Cryospheric Sciences Research Portal. We use the
90 yearly MO from 1979 to 2018, with a spatial resolution of ~25 km. Following the
91 method in Liang and Su (2021), we fill in the missing MO values based on surface air
92 temperature (SAT) datasets from the International Arctic Buoy Programme/Polar
93 Exchange at the Sea Surface (IABP/POLES) for 1979-2004 and the Atmospheric
94 InfraRed Sounder (AIRS) for 2005-2018. Although the missing values are not quite a
95 lot, the analysis here is more convenient if the whole research area in the LS and ESS
96 is covered.

97 The sea ice concentration (SIC) dataset, called Ocean and Sea Ice Satellite
98 Application Facility (OSI SAF), is from the European Organization for the Exploitation
99 of Meteorological Satellites (EUMETSAT) (Lavergne et al., 2019). We use the monthly
100 SIC in May from 1979 to 2018, with a resolution of 25 km. We also examine SIC dataset

101 by the NASA Team algorithm(Cavalieri et al., 1996), which shows basically the same
102 patterns in May as OSI SAF.

103 The atmospheric variables and surface energy fluxes are from the ERA5 reanalysis
104 by the European Centre for Medium-Range Weather Forecasts (ECMWF) (Hersbach et
105 al., 2020), which replaces the ERA-Interim reanalysis that ceased production in 2019.
106 The variables used in this study are monthly downward longwave radiation (DLR), net
107 longwave radiation (NLR), downward shortwave radiation (DSR), net shortwave
108 radiation (NSR), surface latent heat flux (SLHF), surface sensible heat flux (SSHF),
109 total-column water vapor (TWV), and SAT and wind fields at the 850-hPa level, for the
110 month of May from 1979 to 2018. The spatial resolution of ERA5 used in this study is
111 $0.25^{\circ}\times 0.25^{\circ}$, less than 30 km in the region of the Laptev Sea and East Siberian Sea.
112 Note that the four components of the surface energy balance (SEB) include NLR, NSR,
113 SLHF, and SSHF.

114

115

116 **3. Results**

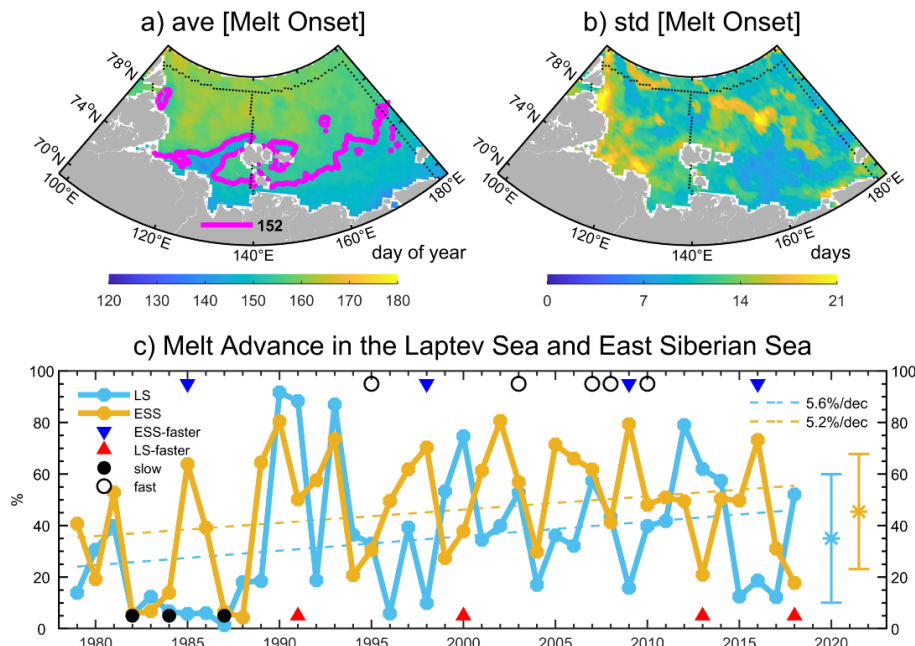
117 *3.1 Distinct Melt Advance Scenarios in the Laptev Sea and East Siberian Sea*

118 Sea ice begins to melt at the surface in spring when solar radiation increases and the
119 atmosphere warms. On average, the sea ice surface in the Laptev Sea (LS) and East
120 Siberian Sea (ESS) begins to melt during May and June (Fig. 1a). Naturally, sea ice
121 melting advances northward in a given year. The range for the interannual change of
122 MO in a given place is expected to be around one month (Fig. 1b). In order to
123 demonstrate the progress of MO in different years, melt advance (MA) is defined by
124 calculating the areal percentage of an individual sea that has experienced MO at the end
125 of May (see magenta contour line in Fig. 1a). In this way, we can detect whether sea-
126 ice surface melting advances slowly or quickly in a specific year, as well as the spatial
127 patterns of the melt advance. For the seasonal prediction of summer sea ice, this metric
128 of Melt Advance is in essence similar to the average MO date, but may have advantages

129 if we can get real-time satellite MO for the region. Then, at the end of May or other
 130 specific date, we can get the MA pattern which supports timely seasonal prediction.

131 Figure 1c shows the time series of MA for the LS and ESS during 1979-2018. The
 132 variability is large, ranging from near zero to 100%. This implies changeable spring
 133 conditions on the interannual scale. On average, MA is around 40% for each sea,
 134 meaning that ~40% of the sea area has experienced sea-ice surface melting at the end
 135 of May. In the context of global warming, MA has an increasing tendency in both seas
 136 although this tendency is not quite significant (less than 6% per decade). This indicates
 137 that we sometimes need to pay more attention to the interannual variability than to the
 138 long-term linear tendency. We can also notice that relatively slow MA in the 1980s
 139 contributes considerably to the overall positive tendency.

140



141

142 **Fig. 1.** (a, b) Climatology and standard deviation of sea ice Melt Onset, and (c) Melt
 143 Advance time series in the Laptev Sea and East Siberian Sea, 1979-2018. The magenta
 144 lines in panel (a) are contours of 152 (day of year), representing the end of May. The
 145 areal percentage of sea ice Melt Onset earlier than 152 (day of year) is defined as Melt
 146 Advance. In panel (c), only the trend of Melt Advance in the ESS is statistically
 147 significant at the 90% confidence level. The average and standard deviation of the Melt
 148 Advance in the LS and ESS are $35\% \pm 25\%$ and $45\% \pm 22\%$, respectively. Sample years
 149 (16 out of the long time-series) that fall into one of four categories are marked (see also
 150 Table 1).

151

152 Another feature is related to the relationship of MA between the LS and ESS. In
153 some years, MA in both the LS and ESS is slow, as in the 1980s; in other years, MA in
154 both seas may be fast; and in other years, MA can be substantially different in the two
155 seas. Thus, four categories of sample years are selected for further composite analysis
156 (Table 1 and markers in Fig. 1c; MA difference between the LS and ESS is shown in
157 Fig. S2), which represent four basic scenarios of MA in this region. Specifically, years
158 with significantly faster MA in the ESS than in the LS ($\delta > 48\%$) are grouped as the ESS-
159 faster-scenario, while years with significantly faster MA in the LS than in the ESS
160 ($\delta > 33\%$) are classified as the LS-faster-scenario. The slow-scenario includes years
161 when MA in both seas is slow (below 20%), while the fast-scenario consists of years
162 when MA in both seas is relatively fast (between 30% and 60% at the same time). So,
163 two pairs of contrasting categories are formed (ESS-faster-scenario vs. LS-faster-
164 scenario, slow-scenario vs. fast-scenario). Note that to some extent the latter two
165 scenarios represent the contrast between the 1980s and subsequent decades. Such
166 categorization also reflects the large variability of MA in spring from the interannual
167 perspective.

168

Category	Years	Description
ESS-faster-scenario	1985, 1998, 2009, 2016	significantly faster Melt Advance ($\delta > 48\%$) in the ESS than in the LS
LS-faster-scenario	1991, 2000, 2013, 2018	significantly faster Melt Advance ($\delta > 33\%$) in the LS than in the ESS
slow-scenario	1982, 1984, 1987	similar but slow Melt Advance ($\delta < 8\%$, but below 20%)
fast-scenario	1995, 2003, 2007, 2008, 2010	similar but fast Melt Advance ($\delta < 9\%$, but between 30% and 60%)

169 **Table 1** List of years under different scenarios of Melt Advance.

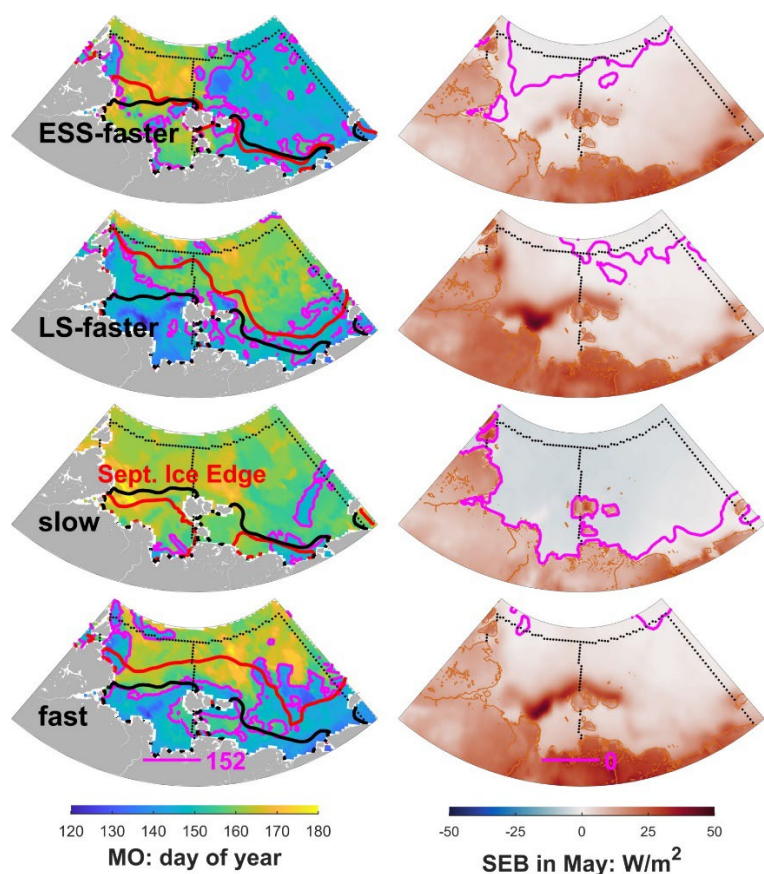
170 Note: Practically, the ESS-faster-scenario and LS-faster-scenario are selected based on
171 one standard deviation of the difference in Melt Advance between the Laptev Sea and
172 East Siberian Sea. The slow-scenario and fast-scenario include years when Melt
173 Advance in the two seas is quite close. All years listed here are marked in Fig. 1c.

174

175 Composite results show that the ESS-faster-scenario has substantially earlier MO,
176 i.e., faster MA in the ESS than in the LS, while the LS-faster-scenario has a somewhat
177 opposite signal (indicated by the magenta line in Fig. 2). For the slow-scenario, little
178 area in either sea has experienced MO until the end of May, indicating slow MA; for
179 the fast-scenario, nearly half of both seas has begun to experience sea-ice surface
180 melting, indicating fast MA at almost the same pace. From the surface energy balance
181 (SEB) in May, we find consistent patterns. With the zero lines of SEB as a reference,
182 the ESS-faster-scenario has relatively more positive SEB in the ESS than in the LS,
183 while the opposite is true for the LS-faster-scenario. For the slow-scenario, SEB is
184 negative over most of the two seas, while for the fast-scenario, SEB is positive in both
185 seas. This fits well with common sense. Although MA-related albedo changes may
186 amplify the SEB signals in a two-way interaction, it is fair to say that SEB in May
187 drives different patterns of MA (see individual years in Fig. S3).

188 In the next section, we investigate systematic processes under different MA
189 scenarios that involve the atmosphere, sea ice, and surface energy fluxes.

190
191



192

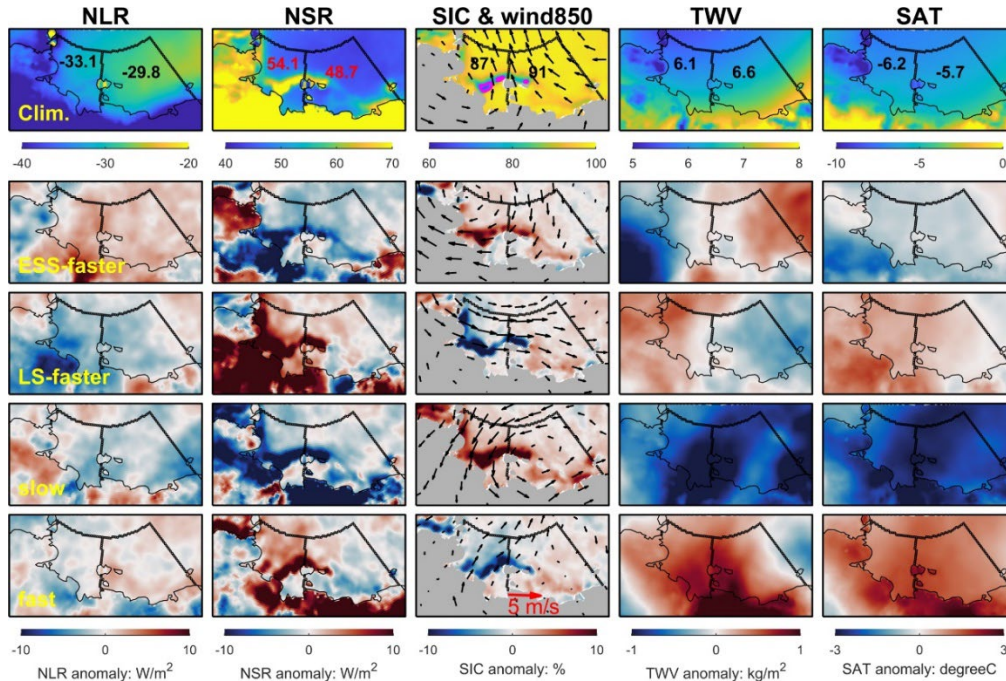
193 **Fig. 2.** Composites of MO and surface energy balance (SEB) in May for the four
 194 scenarios. The left column shows the MO patterns marked by magenta contour lines
 195 with the value of 152 (day of year) which represents the end of May. Red contour lines
 196 show the composite September ice edge, while black contour lines denote the
 197 climatological September ice edge for 1979-2018. The right column is the SEB in May,
 198 with magenta contour lines of zero. Black dots denote the boundaries of the LS and
 199 ESS.

200

201 3.2 Dynamic and Thermodynamic Processes under Different Melt Advance Scenarios

202 Climatologically, SEB is basically positive ($\sim 5 \text{ W/m}^2$) across the two seas in May
 203 (see first row in Fig. S4). Among the components, it is positive net shortwave radiation
 204 (NSR) that compensates for losses from net longwave radiation (NLR), SLHF, and
 205 SSHF. This implies that on average the atmosphere receives energy from the surface
 206 through the latter three components in May. SAT is around -6°C , while sea ice almost
 207 fully covers the ocean ($\sim 90\%$) (see first row in Fig. 3). In the lower troposphere (850
 208 hPa), southeasterlies blow across the region, which to some extent explains the
 209 existence of polynyas in the middle LS, i.e., regions where sea ice concentration is

210 below 75%. Note that Fig. 3 shows only selected vital variables; other relevant factors
 211 can be found in Fig. S4-S7.
 212



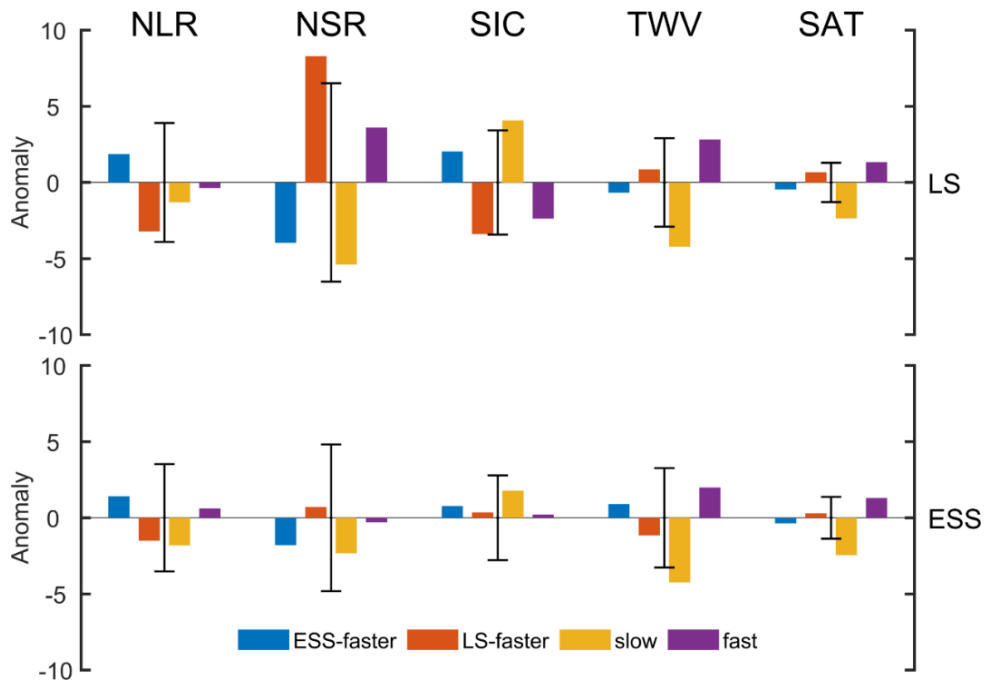
213
 214 **Fig. 3.** Climatology (first row) and composite anomalies for the four scenarios (lower
 215 four rows) of relevant atmospheric and sea ice variables in May: NLR, NSR, SIC, winds
 216 at 850 hPa, TWV, and SAT. Numbers within the LS and ESS are the region-mean values,
 217 respectively. Note that magenta lines in the climatological SIC fields denote contours
 218 of 75% SIC values, which suggest the location of polynyas.

219
 220 In the ESS-faster-scenario (see second row in Fig. 3 and blue bars in Fig. 4),
 221 prevailing northeasterlies in the lower troposphere tend to increase SIC and reduce
 222 polynya area, especially for the LS, which increases surface albedo and decreases solar
 223 radiation absorption. The northeasterlies seem to also bring slightly cool air masses to
 224 the region, and slightly moist air masses to the ESS. Given that sea ice cover is more
 225 packed, longwave radiation loss from the surface to the atmosphere is reduced, which
 226 to some extent compensates for the reduced solar radiation absorption. Due to the
 227 greater negative anomaly of solar radiation absorption in the LS, the net surface energy
 228 balance is a loss in the LS, but a gain in the ESS (Fig. S4 and S6). In addition, sea-ice
 229 surface melting is usually preconditioned by increased water vapor in the atmosphere

230 (Mortin et al., 2016). So, faster Melt Advance in the ESS is expected as TWV is
231 increased in the ESS. However, in this case, as depicted in Fig. 4, no anomaly extends
232 beyond the interannual standard deviation for the LS and ESS, suggesting a risk of over-
233 interpretation. One plausible explanation is that the normal state in this region tends to
234 resemble the ESS-faster-scenario, as indicated by Fig. 1a and the higher climatological
235 Melt Advance value in the ESS compared to the LS shown in Fig. 1c. Additionally,
236 multiple atmospheric setups may lead to the ESS-faster-scenario, highlighting the
237 considerable variability in springtime conditions. Hence, the low signal-to-noise ratio
238 is understandable. It's worth noting that the LS exhibits more notable differences,
239 consistent with its significant polynya activity.

240 For the LS-faster-scenario (see third row in Fig. 3 and red bars in Fig. 4), wind fields
241 at 850-hPa show unified westerlies over the LS and northwesterlies over the ESS, which
242 to some extent account for the reduced sea ice cover in the LS and the slightly packed
243 sea ice in the ESS. While the westerlies may not fully account for the reduced sea ice
244 in the LS, this circulation includes an offshore wind component in the western LS,
245 resulting in increased polynya opening. This includes polynyas such as the Northeast
246 Taymyr polynya, the Taymyr polynya, and the Anabar-Lena polynya (Krumpen et al.,
247 2011). So, we see a substantial increase in solar radiation absorption (beyond one
248 standard deviation) in the LS. While longwave radiation loss is somehow enhanced, the
249 net surface energy balance is still a gain for the LS and a loss for the ESS. The westerlies
250 may also bring warm and wet air masses from the North Atlantic and contribute to
251 positive anomalies of TWV and SAT in the LS, which promotes faster MA. We may
252 expect that reduced sea ice cover in the LS enables more moisture to be released from
253 the exposed ocean. However, latent heat loss as well as sensible heat loss toward
254 atmosphere in the LS weakens (Fig. S4 and S6), which suggests that warmer and
255 moister atmosphere is mainly a result of air mass transport and in turn reduces turbulent
256 heat loss from the surface.

257



258

259 **Fig. 4.** Region-mean composite anomalies in the LS and ESS for the four scenarios
 260 shown in Fig. 3. The error bars denote the corresponding standard deviation for 1979-
 261 2018. The variables of NLR, NSR, SIC, TWV, and SAT have units of W/m^2 , W/m^2 , %,
 262 kg/m^2 , and K, respectively. Here, SIC is represented by the areal percentage of sea ice
 263 cover relative to the whole sea. To facilitate viewing, TWV is scaled by a factor of 5.

264

265 For the slow-scenario (see fourth row in Fig. 3, and orange bars in Fig. 4), a cyclonic
 266 anomaly in the lower troposphere, which is centered on the ESS, pushes sea ice against
 267 the southern coast in the western half of the LS, and against the fast ice zone in the
 268 eastern half, thereby preventing polynya formation. More sea ice cover in both seas
 269 decreases solar radiation absorption. Meanwhile, this region is under the influence of
 270 cold and dry air masses (beyond one standard deviation), which induce a large loss of
 271 longwave radiation and SSHF from the surface. As a whole, we see unified surface
 272 energy deficits in the LS and ESS (beyond one standard deviation). Note that all the
 273 three sample years are from the 1980s. So, the larger sea ice cover and cooler
 274 atmosphere mainly reflect the Arctic state in the 1980s, which is a decadal phenomenon
 275 rather than interannual characteristics. We also examine the monthly snowfall under the
 276 four scenarios (Fig. S5). For this region, snowfall dominates the total precipitation in
 277 May. Especially for the slow melt advance scenario, snowfall is abnormally high, which

278 will also result in high surface albedo.

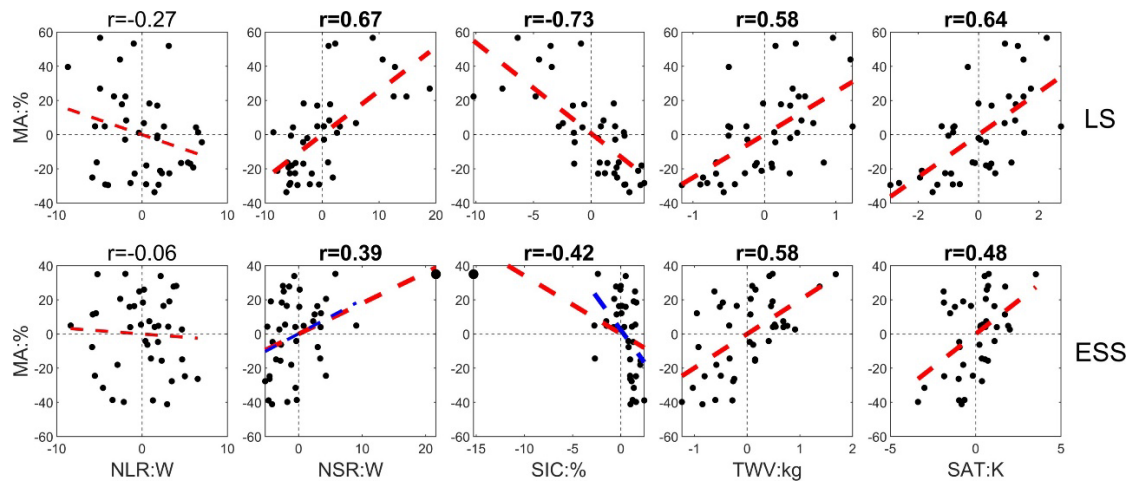
279 For the fast-scenario, with sample years after the 1980s (see last row in Fig. 3, and
280 purple bars in Fig. 4), southerlies in the lower troposphere blow mainly across the LS,
281 which drive sea ice off the coast, open the polynya and in turn increase shortwave
282 radiation absorption. At the same time, the southerlies bring warm and wet air masses
283 to this region, which substantially reduce the SSHF loss from the surface. As a result,
284 we see a positive net surface energy balance in this region and relatively fast MA.

285 The composite analysis above indicates that circulation in the lower troposphere in
286 spring in this region can be quite changeable (see individual years in Fig. S8), which
287 can have two effects: one is related to sea ice dynamics; the other involves moisture
288 and air mass advection. The former produces strong regulation of NSR due to albedo
289 changes, while the latter has everything to do with the atmospheric state, which favors
290 sea-ice surface melting when the atmosphere is warm and wet.

291 Figure 5 further shows the statistical correlation related to MA, covering years from
292 1979 to 2018. In general, we see that faster MA is accompanied by warm and wet
293 atmosphere. The related atmospheric circulation in the lower troposphere may also
294 drive reduced SIC and subsequent increased solar radiation absorption. Note that the
295 variability of SIC and NSR in the ESS is smaller than in the LS if the single outlier is
296 removed from the ESS data (see the second and third plots in the bottom row of Fig. 5).
297 Once more, this is related to the significant polynya activity observed in the LS. In
298 addition, Mortin et al. (2016) argued that on a synoptic scale, increased water vapor in
299 the atmosphere favors stronger DLR, which promotes sea-ice surface melting. Such
300 conclusion makes sense when we focus on sea ice and atmosphere above. While we
301 examine from the perspective of the whole region, including effects of the open ocean,
302 results here suggest that on the subseasonal scale net longwave radiation has little
303 connection with MA (see first column in Fig. 5). To some extent, the weak correlation
304 even shows that on the monthly scale, longwave radiation loss tends to be more when
305 SEB is more and MA is faster, which suggests some negative feedback probably related

306 to the open ocean.

307 While NSR is strong, downward shortwave radiation tends to be less (see Fig. S9),
308 which is expected from more moisture in the atmosphere. However, cloud analysis
309 based on ERA5 reanalysis doesn't suggest significant effects of clouds. Total cloud
310 cover in this region generally is larger than 90% in May and interannual anomaly is
311 relatively small (less than 5%, see Fig. S5). This indicates that from the perspective of
312 anomaly, water vapor rather than cloud cover has considerable radiation effects in the
313 springtime. Given the large uncertainty of clouds in current datasets, this remains an
314 open question.
315



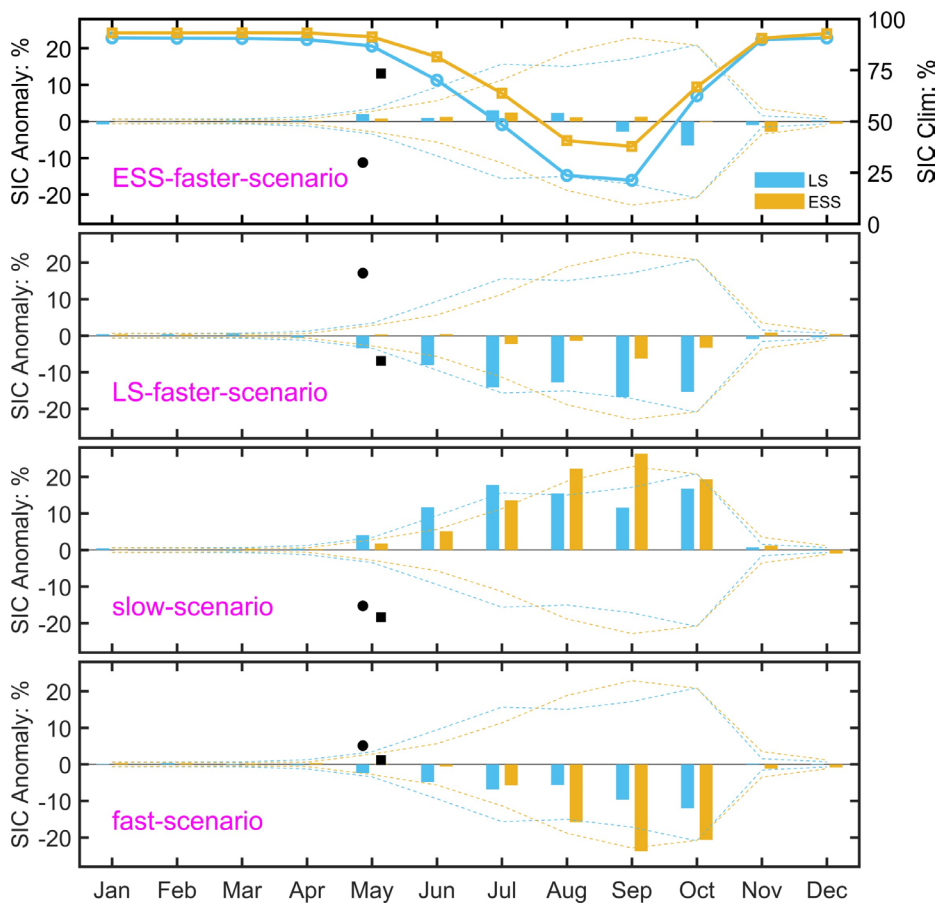
316

317 **Fig. 5.** Scatter plots for the period 1979-2018, illustrating the relationship between the
318 Melt Advance (MA) anomaly and region-mean anomalies of factors shown in Figs. 3
319 and 4. Thick dashed red lines represent linear fits above the 95% confidence level. Bold
320 titles represent correlation above the 95% confidence level. In the second and third plots
321 of the bottom row, thin and thick dashed blue lines respectively denote linear fits after
322 the removal of an outlier, identified by a larger black dot.

323

324 To what extent do different sea-ice surface melting scenarios in spring have
325 implications for sea ice cover in summer? Could we gain seasonal prediction skill based
326 on detection of sea-ice surface melting in spring? For the selected Melt Advance
327 scenarios, sea ice cover in September somewhat responds accordingly (see left column
328 in Fig. 2). In the ESS-faster-scenario, sea ice edge in September is close to climatology.

329 This echoes that the ESS-faster-scenario reflects the climatology of Melt Advance, too
 330 (Fig. 1a). In the LS-faster-scenario, sea ice edge in September retreats more northward
 331 in the LS part. In the slow-scenario, sea ice edge is nearer the southern coast; while in
 332 the fast-scenario, sea ice edge retreats considerably in both seas. The results above
 333 suggest that sea ice edge in September tends to be northward if Melt Advance at the
 334 end of May is fast. Further investigation of seasonal transition of sea ice cover in the
 335 four Melt Advance scenario indicates similar relationship (Fig. 6).
 336

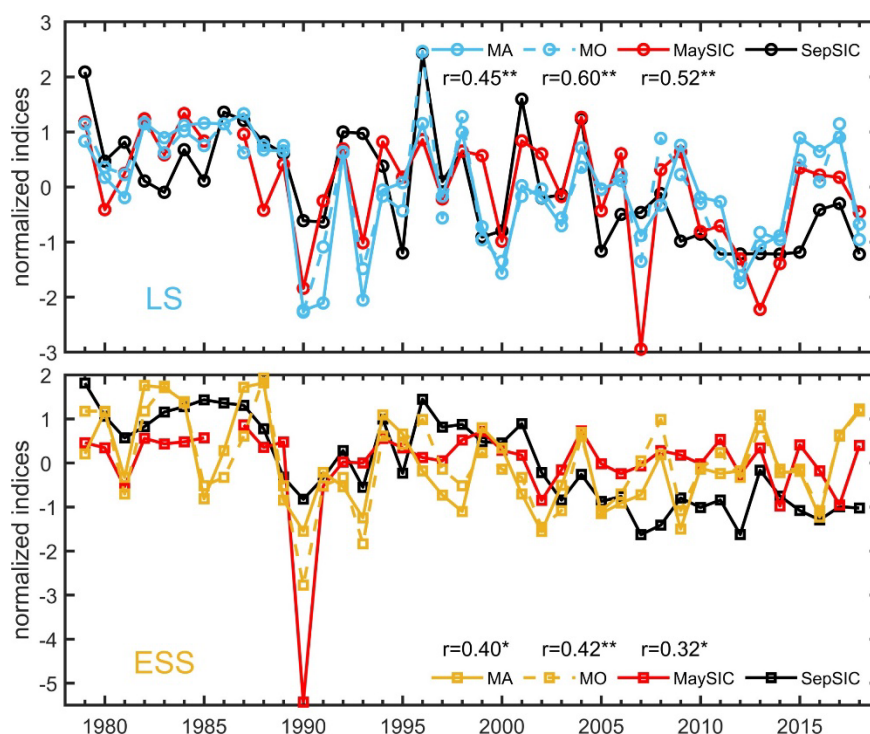


337
 338 **Fig. 6.** Annual cycle of SIC anomaly in the four scenarios of Melt Advance. SIC is
 339 denoted by the areal percentage of sea ice cover relative to the whole sea. Dotted lines
 340 are the standard deviation. The mean Melt Advance in the LS and ESS is also marked
 341 by solid dots and squares.

342

343 Figure 6 shows that in both the LS and ESS, Melt Advance in spring is significantly
 344 correlated with sea ice cover in September, which is consistent with previous studies
 345 utilizing Melt Onset as a predictor of summer sea ice (Petty et al., 2017; Wang et al.,

346 2011). Besides, it has similar prediction skill (statistical correlation) as average MO or
 347 SIC in May. In general, the connection between springtime and summer seems to be
 348 stronger in the LS than in the ESS. Given that the metric of Melt Advance can be
 349 reliably defined on the same day every year (not necessarily the end of May), it has the
 350 potential to be fed into the statistical or Artificial Intelligence prediction of summer sea
 351 ice cover once real-time satellite detection is available. At least, it can be commonly
 352 used as the average Melt Onset. Beyond this, for the prediction of summer sea ice cover,
 353 the seasonal evolution from spring to summer is still a challenge as it is not fully
 354 understood.
 355



356

357 **Fig. 7.** Sea-ice surface Melt Advance, average Melt Onset, and Sea Ice Concentration
 358 (SIC) in May and September in the Laptev Sea (top) and East Siberian Sea (bottom)
 359 from 1979 to 2018. The May and September sea ice cover are denoted by the areal
 360 percentage relative to the whole sea. All variables have been normalized. For better
 361 visualization, Melt Advance is multiplied by -1. Correlation coefficients with double
 362 asterisks denote 99% confidence, while those with a single asterisk denote 90%
 363 confidence.

364

365

366 **4. Discussion**

367 In this study, sampling for different scenarios of sea ice Melt Advance is based on
368 the Melt Onset dataset, which is a satellite observation product. To our knowledge,
369 ERA5 to some extent incorporates the sea ice concentration dataset of OSI SAF, but
370 not the Melt Onset dataset (Hersbach et al., 2020). ERA5 atmospheric reanalysis and
371 different Melt Advance patterns can be seen as independent sources of information and
372 their consistency should provide more confidence.

373 In fact, the concept of Melt Advance can be used for the whole Arctic, and can
374 describe how sea-ice surface melting advances in spring. As mentioned above, Melt
375 Advance can also be used as relatively independent information with reference to an
376 atmospheric reanalysis dataset. Liang and Zhou (2023) identified three modes of Melt
377 Onset in the LS and ESS by EOF decomposition. The positive L-mode and E-mode in
378 their study correspond to LS-faster-scenario and ESS-faster-scenario, while the positive
379 and negative LE-mode relate to fast-scenario and slow-scenario, respectively.

380 Regarding SIC anomaly in the LS and ESS, we should bear in mind that before
381 melting the shelf areas of the LS and ESS are covered with extensive fast ice (up to 200
382 km wide), which is formed by April (Selyuzhenok et al., 2015). SIC in May can increase
383 due to specific wind fields, but it probably does not consolidate against the land. Instead,
384 the SIC anomaly is closely related to polynya development. As Fig. 3 shows, the largest
385 SIC anomaly under the four scenarios usually occurs around the polynya region
386 (Willmes et al., 2011).

387

388

389 **5. Conclusions**

390 In this study, the metric of Melt Advance (MA) is used to measure sea-ice surface
391 melting instead of region-mean Melt Onset. MA is defined as the areal percentage of a
392 sea in which the sea ice surface has begun to melt at the end of May, in this case the

393 Laptev Sea (LS) and East Siberian Sea (ESS). This metric has the potential to help
394 seasonally predict summer sea ice for the whole Arctic.

395 Four representative scenarios of Melt Advance in the LS and ESS are identified: the
396 ESS-faster-scenario, LS-faster-scenario, slow-scenario, and fast-scenario. Composite
397 analyses reveal that in these distinct scenarios of Melt Advance, atmospheric circulation,
398 sea ice dynamics (polynya activities), air mass advection, and surface energy fluxes are
399 related with each other. ESS-faster-scenario is associated with positive TWV anomaly
400 over the ESS and negative TWV anomaly over the LS. LS-faster-scenario and fast-
401 scenario seem to occur when polynya in the Laptev Sea opens. But the slow-scenario
402 mainly reflect the cool Arctic state in the 1980s. In addition, polynya activity in this
403 region and initial sea ice condition are also not neglectable.

404 Although sea ice Melt Advance as well as average Melt Onset and sea ice cover in
405 May are both statistically correlated with sea ice cover in September, seasonal evolution
406 can to a large extent disturb this linkage. This study suggests a need to further
407 investigate the changeable spring circulation in the lower troposphere and seasonal
408 evolution in the Arctic.

409

410

411 *Data Availability Statement.*

412 The sea ice MO dataset is from NASA's Cryospheric Sciences Research Portal
413 (<https://earth.gsfc.nasa.gov/cryo/data/arctic-sea-ice-melt>). SAT of IABP/POLES can be
414 accessed at <https://arcticdata.io/catalog/view/doi:10.18739/A2J598>, and SAT of AIRS
415 at https://disc.gsfc.nasa.gov/datasets/AIRS3STD_006/summary. The SIC dataset of
416 OSI SAF was downloaded from the websites below:
417 <ftp://osisaf.met.no/reprocessed/ice/conc/v2p0/> and
418 <ftp://osisaf.met.no/reprocessed/ice/conc-cont-reproc/v2p0/>.
419 The ERA5 reanalysis dataset was retrieved at
420 [https://cds.climate.copernicus.eu/cdsapp#!/search?type=dataset&keywords=\(\(%20%22Product%20type:%20Reanalysis%22%20\)\)](https://cds.climate.copernicus.eu/cdsapp#!/search?type=dataset&keywords=((%20%22Product%20type:%20Reanalysis%22%20))). In this study, we used ERA5 monthly
422 averaged data at single level and pressure levels.

423

424 *Author Contribution*

425 Hongjie Liang [Formal analysis; Writing original draft].

426 Wen Zhou [Funding acquisition; Supervision].

427

428 *Competing interests*

429 The authors declare that they have no conflict of interest.

430

431 *Acknowledgments.*

432 This work was supported by the National Natural Science Foundation of China (Grant
433 No. 42288101, 42120104001).

434

435

436 REFERENCES

- 437 Bliss, A. and Anderson, M.: Snowmelt onset over Arctic sea ice from passive
438 microwave satellite data: 1979–2012, *The Cryosphere*, 8, 2089–2100, 10.5194/tc-
439 8-2089-2014, 2014.
- 440 Budyko, M. I.: The effect of solar radiation variations on the climate of the Earth, *Tellus*,
441 21, 611–619, 10.1111/j.2153-3490.1969.tb00466.x, 1969.
- 442 Cavalieri, D., Parkinson, C., Gloersen, P., and Zwally, H.: Sea ice concentrations from
443 Nimbus-7 SMMR and DMSP SSM/I passive microwave data, National Snow and
444 Ice Data Center, Boulder, Colorado, USA, 10.5067/8GQ8LZQVL0VL, 1996.
- 445 Cohen, J., Screen, J. A., Furtado, J. C., Barlow, M., Whittleston, D., Coumou, D.,

446 Francis, J., Dethloff, K., Entekhabi, D., Overland, J., and Jones, J.: Recent Arctic
447 amplification and extreme mid-latitude weather, *Nature Geoscience*, 7, 627-637,
448 10.1038/ngeo2234, 2014.

449 Crawford, A. D., Horvath, S., Stroeve, J., Balaji, R., and Serreze, M. C.: Modulation of
450 Sea Ice Melt Onset and Retreat in the Laptev Sea by the Timing of Snow Retreat
451 in the West Siberian Plain, *Journal of Geophysical Research: Atmospheres*, 123,
452 8691-8707, 10.1029/2018jd028697, 2018.

453 Drobot, S. D. and Anderson, M. R.: An improved method for determining snowmelt
454 onset dates over Arctic sea ice using scanning multichannel microwave radiometer
455 and Special Sensor Microwave/Imager data, *Journal of Geophysical Research:*
456 *Atmospheres*, 106, 24033-24049, 10.1029/2000JD000171, 2001.

457 Francis, J. A. and Vavrus, S. J.: Evidence for a wavier jet stream in response to rapid
458 Arctic warming, *Environmental Research Letters*, 10, 10.1088/1748-
459 9326/10/1/014005, 2015.

460 Hersbach, H., Bell, B., Berrisford, P., Hirahara, S., Horányi, A., Muñoz - Sabater, J.,
461 Nicolas, J., Peubey, C., Radu, R., Schepers, D., Simmons, A., Soci, C., Abdalla,
462 S., Abellan, X., Balsamo, G., Bechtold, P., Biavati, G., Bidlot, J., Bonavita, M.,
463 Chiara, G., Dahlgren, P., Dee, D., Diamantakis, M., Dragani, R., Flemming, J.,
464 Forbes, R., Fuentes, M., Geer, A., Haimberger, L., Healy, S., Hogan, R. J., Hólm,
465 E., Janisková, M., Keeley, S., Laloyaux, P., Lopez, P., Lupu, C., Radnoti, G.,
466 Rosnay, P., Rozum, I., Vamborg, F., Villaume, S., and Thépaut, J. N.: The ERA5
467 global reanalysis, *Quarterly Journal of the Royal Meteorological Society*, 146,
468 1999-2049, 10.1002/qj.3803, 2020.

469 Horvath, S., Stroeve, J., Rajagopalan, B., and Jahn, A.: Arctic sea ice melt onset favored
470 by an atmospheric pressure pattern reminiscent of the North American-Eurasian
471 Arctic pattern, *Climate Dynamics*, 57, 1771-1787, 10.1007/s00382-021-05776-y,
472 2021.

473 Kashiwase, H., Ohshima, K. I., Nishashi, S., and Eicken, H.: Evidence for ice-ocean
474 albedo feedback in the Arctic Ocean shifting to a seasonal ice zone, *Sci Rep*, 7,
475 8170, 10.1038/s41598-017-08467-z, 2017.

476 Krumpen, T., Hölemann, J. A., Willmes, S., Morales Maqueda, M. A., Busche, T.,
477 Dmitrenko, I. A., Gerdes, R., Haas, C., Heinemann, G., Hendricks, S., Kassens,
478 H., Rabenstein, L., and Schröder, D.: Sea ice production and water mass
479 modification in the eastern Laptev Sea, *Journal of Geophysical Research*, 116,
480 10.1029/2010jc006545, 2011.

481 Lavergne, T., Sørensen, A. M., Kern, S., Tonboe, R., Notz, D., Aaboe, S., Bell, L.,
482 Dybkjær, G., Eastwood, S., Gabarro, C., Heygster, G., Killie, M. A., Brandt
483 Kreiner, M., Lavelle, J., Saldo, R., Sandven, S., and Pedersen, L. T.: Version 2 of
484 the EUMETSAT OSI SAF and ESA CCI sea-ice concentration climate data
485 records, *The Cryosphere*, 13, 49-78, 10.5194/tc-13-49-2019, 2019.

486 Lei, R., Cheng, B., Hoppmann, M., Zhang, F., Zuo, G., Hutchings, J. K., Lin, L., Lan,
487 M., Wang, H., Regnery, J., Krumpen, T., Haapala, J., Rabe, B., Perovich, D. K.,

488 and Nicolaus, M.: Seasonality and timing of sea ice mass balance and heat fluxes
489 in the Arctic transpolar drift during 2019–2020, *Elementa: Science of the*
490 *Anthropocene*, 10, 10.1525/elementa.2021.000089, 2022.

491 Liang, H. and Su, J.: Variability in Sea Ice Melt Onset in the Arctic Northeast Passage:
492 Seesaw of the Laptev Sea and the East Siberian Sea, *Journal of Geophysical*
493 *Research: Oceans*, 126, e2020JC016985, 10.1029/2020JC016985, 2021.

494 Liang, H. and Zhou, W.: Arctic Sea Ice Melt Onset in the Laptev Sea and East Siberian
495 Sea in Association with the Arctic Oscillation and Barents Oscillation, *Journal of*
496 *Climate*, 36, 6363-6373, 10.1175/jcli-d-22-0791.1, 2023.

497 Markus, T., Stroeve, J. C., and Miller, J.: Recent changes in Arctic sea ice melt onset,
498 freezeup, and melt season length, *Journal of Geophysical Research (Oceans)*, 114,
499 C12024, 10.1029/2009jc005436, 2009.

500 Mortin, J., Svensson, G., Graverson, R. G., Kapsch, M.-L., Stroeve, J. C., and Boisvert,
501 L. N.: Melt onset over Arctic sea ice controlled by atmospheric moisture transport,
502 *Geophysical Research Letters*, 43, 6636-6642, 10.1002/2016GL069330, 2016.

503 Petty, A. A., Kurtz, N. T., Kwok, R., Markus, T., and Neumann, T. A.: Winter Arctic Sea
504 Ice Thickness From ICESat - 2 Freeboards, *Journal of Geophysical Research:*
505 *Oceans*, 125, 10.1029/2019jc015764, 2020.

506 Petty, A. A., Schröder, D., Stroeve, J. C., Markus, T., Miller, J., Kurtz, N. T., Feltham,
507 D. L., and Flocco, D.: Skillful spring forecasts of September Arctic sea ice extent
508 using passive microwave sea ice observations, *Earth's Future*, 5, 254-263,
509 10.1002/2016ef000495, 2017.

510 Screen, J. A. and Simmonds, I.: The central role of diminishing sea ice in recent Arctic
511 temperature amplification, *Nature*, 464, 1334-1337, 10.1038/nature09051, 2010.

512 Sellers, W. D.: A Global Climatic Model Based on the Energy Balance of the Earth-
513 Atmosphere System, *Journal of Applied Meteorology and Climatology*, 8, 392-
514 400, 10.1175/1520-0450(1969)008<0392:agcmbo>2.0.co;2, 1969.

515 Selyuzhenok, V., Krumpfen, T., Mahoney, A., Janout, M., and Gerdes, R.: Seasonal and
516 interannual variability of fast ice extent in the southeastern Laptev Sea between
517 1999 and 2013, *Journal of Geophysical Research: Oceans*, 120, 7791-7806,
518 10.1002/2015jc011135, 2015.

519 Serreze, M. C., Barrett, A. P., Stroeve, J. C., Kindig, D. N., and Holland, M. M.: The
520 emergence of surface-based Arctic amplification, *The Cryosphere*, 3, 11-19,
521 10.5194/tc-3-11-2009, 2009.

522 Skeie, P.: Meridional flow variability over the Nordic Seas in the Arctic oscillation
523 framework, *Geophysical Research Letters*, 27, 2569-2572, 10.1029/2000gl011529,
524 2000.

525 Stroeve, J. and Notz, D.: Changing state of Arctic sea ice across all seasons,
526 *Environmental Research Letters*, 13, 103001, 10.1088/1748-9326/aade56, 2018.

527 Stroeve, J. C., Markus, T., Boisvert, L., Miller, J., and Barrett, A.: Changes in Arctic
528 melt season and implications for sea ice loss, *Geophysical Research Letters*, 41,
529 1216-1225, 10.1002/2013gl058951, 2014.

530 Taylor, P. C., Boeke, R. C., Boisvert, L. N., Feldl, N., Henry, M., Huang, Y., Langen, P.
531 L., Liu, W., Pithan, F., Sejas, S. A., and Tan, I.: Process Drivers, Inter-Model
532 Spread, and the Path Forward: A Review of Amplified Arctic Warming, *Frontiers*
533 *in Earth Science*, 9, 10.3389/feart.2021.758361, 2022.

534 Wang, L., Wolken, G. J., Sharp, M. J., Howell, S. E. L., Derksen, C., Brown, R. D.,
535 Markus, T., and Cole, J.: Integrated pan-Arctic melt onset detection from satellite
536 active and passive microwave measurements, 2000-2009, *Journal of Geophysical*
537 *Research: Atmospheres*, 116, 10.1029/2011jd016256, 2011.

538 Willmes, S., Adams, S., Schröder, D., and Heinemann, G.: Spatio-temporal variability
539 of polynya dynamics and ice production in the Laptev Sea between the winters of
540 1979/80 and 2007/08, *Polar Research*, 30, 10.3402/polar.v30i0.5971, 2011.

541