

1 Modeling heat flux in the Beaufort Gyre between 2016 and 2019.

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7

8 **Abstract**

9 Leads are a primary component of heat flux during polar night-time in the Arctic Ocean.

10 During the winter, there is negligible shortwave radiation incident on the ice surface. Instead,

11 open water and thin ice lead formations on the ice are the primary contributors of longwave

12 radiation. In fact, open water leads produce turbulent heat flux up to 600 W.m^{-2} while multi-year

13 ice is typically less than 5 W.m^{-2} (Maykut, 1982). This paper models and compares net heat flux

14 over sea ice using ERA5 monthly averaged reanalysis data with intramonthly lead fractions for

15 the winter months between 2016 and 2019.

16 **Introduction**

17 The thermodynamics surrounding Arctic sea ice is a prolific area of research with

18 increasing application in the global climate change problem. Polar latent and sensible heat flux

19 are driving forces regarding the change in sea ice cover and dynamics (Bourassa et al., 2013).

20 Vertical heat exchange from the ice layer to the atmosphere's boundary layer control the changes

21 in energy available in high latitude regions during Polar nighttime. Bourassa et al. (2013),

22 describe heat flux as a function of strong katabatic winds, sea ice lead prevalence and

23 orientation, the presence of polynyas, deep water formation, circulation, freshwater input from

24 snow and air-sea temperature changes. In the Beaufort gyre, there is an observed reduction in the

25 volume of thickness of pack ice over the past 35 years (Hutchings et al., 2008, Parkinson and

26 Cavalieri, 2002; Comiso 2002, Wadhams and Davis, 2000; Tucker et al., 2001; Rothrock et al.,
27 1999) and has impacted changes in sea ice processes and features such as ice-albedo (Ackley et
28 al., 2020, Rösel et al., 2011, Miao et al., 2015, Tschudi et al., 2008, Perovich 1996 and 2002) as
29 well as the growth and extent of open water features such as polynyas and melt ponds
30 (Macdonald et al., 2023, Dai et al., 2020, Scharien et al., 2017) and leads (Lohse et al., 2019,
31 2020 and 2021, Willmes and Heinemann, 2015, Brohan and Kaleschke, 2014, Röhrs and
32 Kaleschke, 2012, Lindsay and Rothrock, 1995).

33 Heat regulators in the Arctic such as leads (Li et al., 2020) facilitate energy and gaseous
34 exchange (Gosink, 1976 and DeLille et al., 2014) during Polar night-time in the Arctic and
35 contribute to the global climate by influencing atmospheric exchanges. Open water and newly
36 frozen leads account for the first and second-largest heat fluxes in the atmosphere, producing
37 boundary layer clouds (Li et al., 2020, Marcq and Weiss, 2012, Maykut 1982). In contrast, the
38 lowest heat exchanges occur over thick ice areas (Li et al., 2020). Studying the changes in heat
39 flux over the Arctic and Antarctic is critical as increasing evidence of reductions in ice sheets,
40 glacier mass balance and snow cover are recorded (Lemke et al., 2007).

41 The Beaufort Gyre has a clockwise oscillation, that sits North and West of the Alaskan
42 coastline and Banks Island, respectively (Talley 2011). This movement of the ocean provides
43 typically, an eastward movement of ice from the Gyre into the larger Arctic Ocean. However, the
44 Beaufort Gyre is also known to revert to an anti-clockwise motion, concentrating the newly
45 formed ice in the opposite direction. Heat exchange from the sea ice surface to the atmosphere is
46 observed in this study, during the mid-winter seasons in the Beaufort Sea. Li et al., (2020)
47 describe the change in heat flux over a 6-hour timeframe with respect to changes in lead type. In
48 this study, we calculate heat flux as described by Cheng et al., (2017) to illustrate the change in

49 heat flux. Understanding the changes in heat flux can provide further motivation to study sea ice
50 changes with respect to global change and climate studies.

51 **Study area**

52 The study area is approximately 300 miles offshore Barrow, Alaska into the Beaufort Sea
53 area. The Beaufort Sea is approximately 500,000 km² in surface area and roughly located ~70 –
54 75° N and 120-160 °W in the Arctic Ocean (Figure 1). The boundaries of the wedge-shaped
55 geometry of the Beaufort Sea are flanked in the West nearby Point Barrow, in the east by Banks
56 Island, and the lower Canadian Archipelago while fixed against the coast of the Alaskan and
57 Canadian boundaries. The northern edge of the Beaufort Sea is a straight-line edge leading near
58 Point Barrow to the Southern tip of Prince Patrick Island. This area was selected as an optimal
59 lead energy flux area as described by Li, et.al, (2020) and suggests an estimate of net heat flux
60 over the Beaufort Gyre shown in Figure 2. According to the United States Census Bureau, this
61 region is roughly 1,300 miles south of the North Pole and 320 miles north of the Arctic Circle,
62 resulting in a cold and dry polar climate. Barrow itself, is a tundra environment characterized
63 largely by permafrost that is proximately 1,300 feet in depth.

64 The upwelling of ocean currents allows heat, gas and moisture exchange fluxes between
65 the ocean and atmosphere over the studied area. This is one of the influences of heat exchange by
66 way of thermal ocean currents that cause temperatures in the Arctic to be generally warmer than
67 those in the Antarctic. This unique dynamic is a point of interest for studying thermodynamics in
68 the Arctic.

69

70 *Figure 1: The Beaufort Sea location in the heat flux study denoted in dark green adapted from Yang et*
71 *al., 2023.*

72 *Figure 2: Heat flux estimates from midwinter Arctic leads form and dissipate low clouds in Li et al.*
73 *(2020).*

74 **Data and Methods**

75 We calculate the net heat flux over the Beaufort Gyre described by Cheng et al., (2017) as Q (in
76 $W.m^{-2}$) in the Beaufort Gyre using the near-surface atmospheric input data as monthly averaged
77 air temperature at 2m, dewpoint temperature at 2m, windspeed and vector winds at 10m from
78 ERA reanalysis data with spatial resolution of $0.25^\circ \times 0.25^\circ$ where:

$$79 \quad Q = -L_o + F_s + F_e \quad \text{eq. 5.}$$

80 Where L_o is the upward thermal radiation and F_s and F_e are the sensible and latent heat
81 flux.

82 L_o is calculated using the Stefan-Boltzmann Law where:

$$83 \quad L_o = \varepsilon \sigma T_0 \quad \text{eq. 6.}$$

84 Where ε is the longwave emissivity of open water (0.99), σ is the Stefan-Boltzman
85 constant ($5.67 \times 10^{-8} W^{-2}.K^{-4}$) and T_0 is the freezing point of seawater at the water surface (T_s , in
86 K.)

$$87 \quad T_0 = T_s = 273.15 - 0.0137 - 0.05199sw - 0.00007225sw \quad \text{eq. 7.}$$

88 Where sw (in %) is the salinity of sea water, estimated at 34%.

89 Sensible (F_s) and latent heat flux (F_e) are calculated by:

$$90 \quad F_s = \rho_a C_p C_s U (T_a - T_0) \quad \text{eq. 8.}$$

91 And

$$92 \quad F_e = 0.622 \rho_a L_v C_e U (re_a - e_s) / P_0 \quad \text{eq. 9.}$$

93 Where ρ_a is the density of air at standard atmospheric pressure at $0^\circ C$, taken as $1.3 kg.m^{-3}$,
94 C_p is the specific heat of air at constant pressure, taken as $1004 J.kg^{-1}.K^{-1}$, U (in $m.s^{-1}$) is the

95 windspeed at 10-m, and T_a (in K) is the air temperature at 2 m both taken from the processed
96 ERA5 data. C_s and C_e are bulk transfer coefficients for sensible and latent heat respectively, both
97 assumed at 0.00144. P_0 (in pa) is the surface air pressure, L_v (in $J.Kg^{-1}$) is the latent heat of water
98 vaporization, r is the relative humidity, e_a (in pa) is the saturation water vapor pressure at the air
99 temperature, re_a is the actual water vapor of the air and e_s is (in pa) is the saturated water vapor
100 pressure at the surface temperature and are calculated as:

$$101 \quad L_v = (2.501 - 0.00237(T_s - 273.15)) * 10^6 \quad \text{eq. 10.}$$

$$102 \quad e_s = 611.21 * 10^{(9.8094 * (T_0 - 273.15) / (T_0 + 0.71))} \quad \text{eq. 11.}$$

$$103 \quad re_a = 611.21 * 10^{(9.8094 * (T_d - 273.15) / (T_d + 0.71))} \quad \text{eq. 12.}$$

104 where T_d is the dewpoint temperature taken from the ERA5 processed data. In this study, we use
105 the 10-m windspeed and 10-m vector components to estimate the net heat flux which can over or
106 underestimate the model.

107 **Results and discussion**

108 The Beaufort Gyre is dynamic with a heat circulatory system (Figure 3) that periodically
109 expresses reversals in rotation. For example, the figure shows that there is a strong change in
110 higher heat concentrations from the western and south-western to eastern flanks of the gyre
111 between December 2017 to February 2018. However, there appears to be smaller variations in
112 heat flux between December 2016 with respect to January and February 2017. The figure shows
113 yearly changes in heat flux where higher heat exchange is expressed in the south-eastern segment
114 of the gyre in December 2016, then from the western flank in December 2017 and back again
115 from the south-east, offshore Bank's island in December 2018. A similar relationship exists in
116 the January plots. In January, the heat concentration remains higher from the western bank of the
117 gyre in 2018 to 2019 instead of returning to higher concentration towards the south-east as in

118 December 2016-2018. However, in 2017 the higher concentration of heat flux is towards the
119 south-west of the gyre in February, but the concentration becomes higher towards the east of the
120 gyre in February 2018 and 2019. The gyre also displays intramonthly reversals of heat
121 concentration. In December 2016, the gyre's high heat flux is towards the south-east until
122 January 2017 which then changes towards the south-west in February 2017. In December 2017,
123 the gyre shows a strong high flux from its western edge until January 2017. This changes
124 towards the east by February 2018. The gyre then shows its highest flux again towards the south-
125 east of the gyre in December 2018. However, the gyre changes to high concentrations in January
126 2019 from the west and then returns to high concentration from the south-east in February 2019.
127

128 *Figure 3: Heat flux changes in the Beaufort Gyre for the winter periods December to February from*
129 *2016-2019.*

130 The gyre may demonstrate small and large scale systems that influence the rate of heat
131 flux across the basin. West of Bank's island is the Fram Strait where a polynya opens at the
132 height of the winter period of the Gyre. This pervasive open water feature is a source of high
133 heat flux, driving up the total rate of flux. However, the changes in heat flux each year express a
134 more complex system, that is not readily described by the strait or other nearby polynyas.

135 ***Spatial distribution of net heat flux across the Beaufort Gyre***

136 The net heat flux estimated using the 10m vector and windspeed can be compared to the
137 ERA5 derived net flux as a ground truth. Figure 4a-c shows the ERA5 derived net heat flux for
138 the winter period taken December – February for the years 2016 – 2019 alongside the calculated
139 heat fluxes for the same time series using the 10m vector wind and windspeed components in the
140 Beaufort Sea.

141 The ERA5 results show the changes in net heat flux over the Beaufort Sea throughout the
142 winter period for the time series. The derived results show the calculated net flux as described in
143 the method. While the range of values coincide between themselves as well as that reported in Li
144 et al., (2020), the spatial distribution of flux in each month across the years differ.

145 The 10m vector wind estimate of net flux in December 2016 (Figure 4a) shows lower
146 heat flux within the scope of the ERA5 data. The 10m windspeed estimate shows higher net flux
147 over the Beaufort Sea. However, both the 10m vector estimate and ground truth suggest higher
148 fluxes towards the northerly segments of the gyre. In contrast, the 10m windspeed estimate
149 shows its lowest flux towards the north in the gyre. By December 2017, the calculated estimates
150 show agreement in high concentration distribution across the gyre with higher flux across the
151 central, west-east segment of the gyre. The calculated flux in December 2017 shows their highest
152 concentrations to the west of the gyre, while the ground truth shows its highest flux to the north-
153 east. On the other hand, the gradient of the heat flux decreases towards the north-east in the
154 calculated estimates.

155

156 *Figure 4a: Net heat flux for December 2016 – 2019 over the Beaufort Sea using ERA reanalysis data with*
157 *ERA5 net heat fluxes, 10m windspeed and 10m vector wind estimates from 2016 – 2019.*

158

159 *Figure 4b: Net heat flux for January 2016 – 2019 over the Beaufort Sea using ERA reanalysis data with*
160 *ERA5 net heat fluxes, 10m windspeed and 10m vector wind estimates from 2017 – 2019.*

161

162 *Figure 4c: Net heat flux for February 2016 – 2019 over the Beaufort Sea using ERA reanalysis data with*
163 *ERA5 net heat fluxes, 10m windspeed and 10m vector wind estimates from 2017 – 2019.*

164

165 In December 2018 (Figure 4a), the heat flux gradient increases toward the north-east as
166 well, however, the calculated flux estimates do not show similar stratification. Instead, the flux is

167 higher and lower in the south-eastern segment of the Beaufort gyre in the 10m windspeed and
168 vector respectively. The December 2018 estimate in the 10m vector shows a concentration of
169 higher flux in a strong west-east orientation while the 10m windspeed shows stratification of the
170 flux gradient increasing towards the south. The ground truth in December 2018 however, shows
171 the highest flux towards the north-east, in disagreement with the calculated estimates.

172 Finally, in December 2019, the ground truth shows high heat flux in the north of the gyre
173 and lower flux towards the south. There is a small increase just south of Bank's Island to the
174 south-east of the gyre. This small increase appears more southerly in the calculated estimates.
175 However, the 10m windspeed estimate shows a more northerly concentration of high net flux
176 while this is shown in a more north-westerly direction in the 10m vector estimate. The 10m
177 windspeed and ground truth show a lower net flux in the north-west segment of the gyre,
178 contrasting the spatial distribution in the 10m vector estimate.

179 In January 2017 (Figure 4b), the ground truth and 10m vector estimate show higher net
180 flux towards the northern segments of the gyre. The 10m windspeed contrasts that, showing a
181 stronger concentration of higher flux to the southern segment of the gyre. This changes in
182 January 2018, where the ground truth shows lower flux to the west to south-west of the gyre,
183 while the calculated estimates show higher flux in that area. This result continues in January
184 2019, however, the net flux is higher in distribution than that of January 2018.

185 February 2017 shows agreement among the ground truth and the calculated estimates
186 where the reduction of net flux is concentrated towards the south-eastern segment of the gyre.
187 However, the ground truth shows higher flux across the northern boundary of the gyre while the
188 10m windspeed shows its highest flux towards the south-western edge of the gyre. The 10m
189 vector estimate shows a north-east to south-west distribution of high heat flux in the gyre with

190 the highest concentrations towards the north-east and its lowest concentrations towards the north-
191 west. The 10m windspeed estimate also shows a north-east to south-west distribution of higher
192 heat flux, however, the lower concentration is in the opposite direction, towards the north-east.

193 February 2018 (Figure 4c) shows an even greater disagreement of net flux estimate from
194 the ground truth with respect to the calculated estimates. The calculated estimates show strong
195 high net flux towards the east of the gyre. The ground truth shows a similar spatial change,
196 however, the total flux does not exceed 450 W.m^{-2} in the east. In addition, a strong north-east to
197 easterly lower flux concentration across the gyre that does not appear as concentrated in the
198 calculated estimates. In addition to this, the highest net flux in the ground truth is shown in the
199 most north-western point of the gyre. This is illustrated as the lowest net flux in both calculated
200 estimates. However, by February 2019, the highest flux is shown towards the north-east of the
201 gyre in both the ground truth and 10m vector wind estimates. While the 10m vector estimate and
202 the ground truth show an intrusion of lower flux from the west to the east of the gyre, the 10m
203 windspeed does not show this orientation. Instead, the 10m windspeed estimate shows lower net
204 flux towards the north of the gyre and high flux towards the southern edge of the gyre.

205 While the 10m vector can be used to estimate the net flux across the Gyre, the 10m
206 windspeed estimate is commonly used to derive the total net flux. Still, neither the 10m
207 windspeed nor the 10m vector estimates consistently show similarity in distribution with the
208 ERA5 estimate or each other. To capture a true representation of the net flux in the gyre, it would
209 be useful to derive glider data to retrieve in-field measurements.

210 *Net heat flux changes through the winter periods 2016-2019*

211 The Winter period in the Arctic in this study is denoted from December to February.
212 Using the ground truth, ERA5 derived net flux over the Beaufort gyre shown in figure 5, the net

213 heat flux during winter shows higher concentrations in the north to north-eastern segments of the
214 gyre consistently. However, there are smaller changes over the years at the frost onset
215 (December) and frost maximum (February) in the gyre. Since the high net flux is strongly related
216 to the prevalence of open water leads and polynyas in the gyre, we can suggest that these areas
217 are dominated by these features.

218 Figure 5 shows the December 2017 heat flux with high flux towards the northern edge of
219 the gyre. However, there is a plume of high flux towards the south-western edge of the gyre
220 appearing in January 2017. This plume is shown in January and February 2017 while increasing
221 in size, as well as in January 2018. The south-western edge of the Beaufort Sea into the Chukchi
222 Sea is flanked with polynyas (Martin 2019). These polynyas are new ice generating areas in the
223 Beaufort, producing juvenile ice that later congeals and consolidates in the Arctic Ocean.
224 In December 2017, high net flux is shown in the north-eastern segment of the gyre while lower
225 flux occurs to the south-east. However, by January and February 2017, the high flux is
226 distributed across the north to north-western edge of the Beaufort while maintaining lower flux
227 towards the south-east. With the clockwise movement of the gyre, the new, thin ice is formed
228 near the coast of Alaska, and moved towards the Chukchi Sea alongside the transpolar drift. As
229 the ice congeals, becoming thicker ice at the height of the winter, ice kinematics allows the
230 formation of leads towards the northern segments of the Beaufort gyre. This behaviour continues
231 in 2018, where in December 2018, the high flux is concentrated to the north-eastern segment of
232 the gyre. Still, a small area of high flux is shown to the most north-western tip of the gyre from
233 December to February 2018. In December 2019, the high flux has switched to the north to north-
234 western segment of the gyre. However, the high flux is seen primarily to the north-east of the
235 gyre in January and February 2019 with a small area of high flux to the north-west. The Beaufort

236 gyre is also known to revert to an anticlockwise rotation against the transpolar drift and
237 demonstrates this here. The total heat flux over the Beaufort Sea during the 2016-2019 period
238 shows the cyclical movement and its reversal of the gyre.

239

240 *Figure 5: Net heat flux for December to February (2017 – 2019) over the Beaufort Sea using ERA5*
241 *reanalysis net heat flux data.*

242 **Conclusions**

243 The Beaufort gyre shows dynamic changes in its net heat flux over the 2016-2019 period. When
244 comparing the results of the ground truth ERA5 derived net flux to the 10m windspeed and
245 vector wind results, the calculated estimates show similarities and differences with each other
246 and the ground truth data. While the range of total flux is congruent, the spatial distribution of
247 net flux is highly variable across the models. Of course, the simplicity of the heat flux
248 calculations are expected to yield very generalized results. However, there are some spatial
249 disparities with the recommended 10m windspeed that are incongruent with the 10m vector wind
250 and ERA5 ground truth data. While both calculated results appear to show variation in the net
251 flux when compared to the ground truth, the 10m vector wind calculation does show closer
252 distributions to the ERA5 model, despite its quantitative overestimation. On the other hand, the
253 10m windspeed appears to generally underestimate the ERA5 ground truth.

254 One of the most prominent features of the Beaufort gyre is its ability to create new ice to
255 distribute throughout the Arctic Ocean. The Beaufort gyre is considered an "ice nursery" with the
256 concentration of polynyas stretching from the Chukchi into the Beaufort Sea. The polynya area is
257 a factory of new ice production that, in tandem with katabatic winds etc., create new ice or
258 "grease ice" that eventually congeals and consolidates to thick and sometimes multi-year ice. As
259 this ice is created along the coast during the frost onset, it is transported north to the larger Arctic

260 Ocean with the transpolar drift. As the frost maximum approaches, the consolidated ice is
261 subjected to divergent, convergent and sheer stresses whose kinematics form sea ice leads.

262 As the ice drifts towards the north while creating leads, the leads provide heat energy
263 from the sea ice surface to the boundary layer of the atmosphere. In these high lead prevalent
264 areas are the high heat flux concentrations shown in our results. Still, the concentration is subject
265 to change, depending on the clockwise or sometimes anticlockwise movement of the gyre.

266

267 *Author Contributions*

268 JW was the primary producer of the study, processed and analyzed all the data and edited the
269 manuscript.

270

271 *Competing interests*

272 The author declares no competing interest.

273

274 *Financial support*

275 This work was funded by NASA CAMEE grant#: 80NSSC19M0194.

276

277 *Acknowledgments*

278 We'd like to thank NASA CAMEE grant#: 80NSSC19M0194 for funding this research. Thanks
279 to Stephen F. Ackley, Alberto M. Mestas-Nuñez, John Cassano and Grant Macdonald for their
280 contributions to the study as well as Alexander Kurapov and the NOAA Coastal modeling
281 seminar for accommodating discussions about the study.

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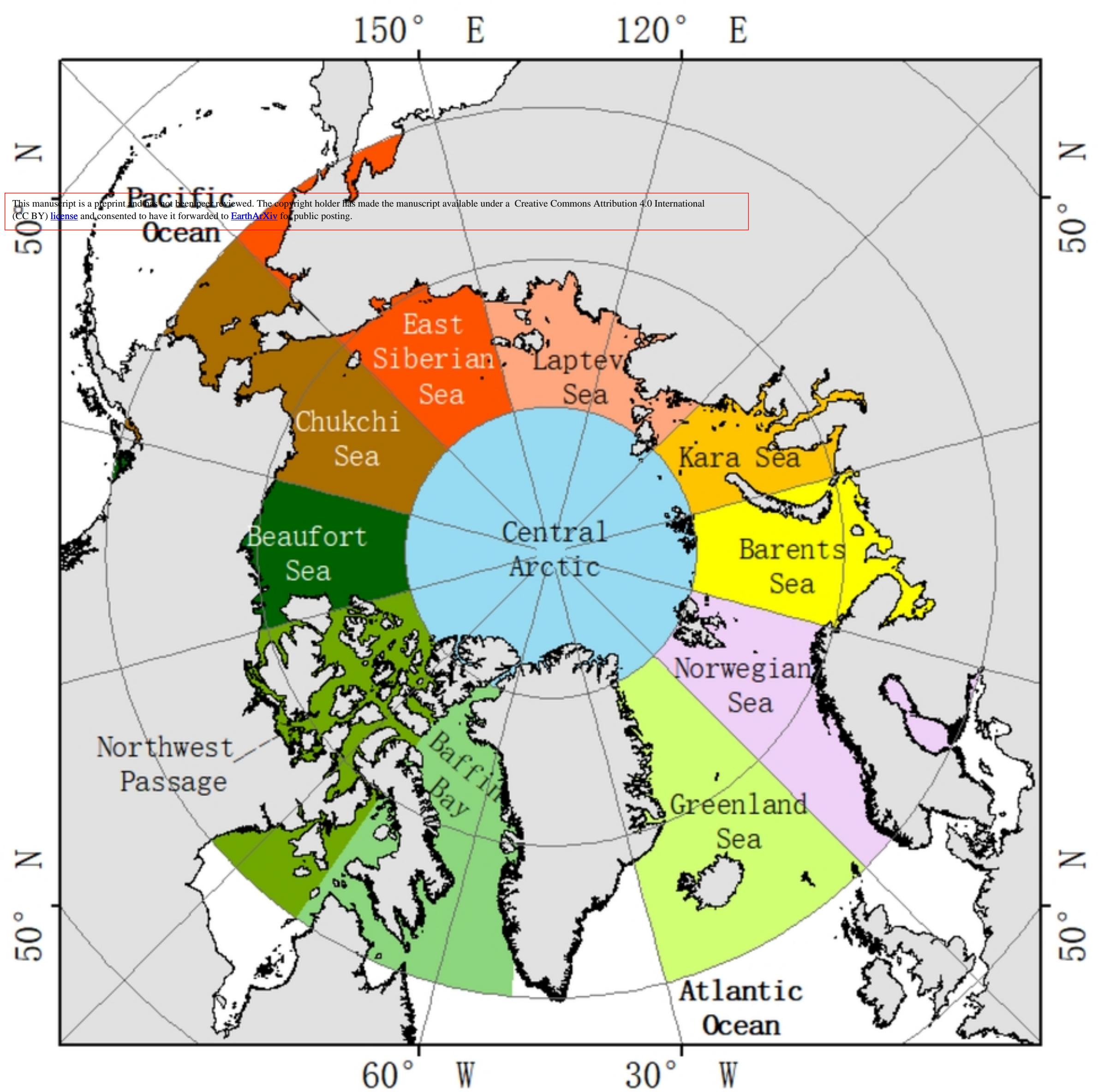


Figure 1

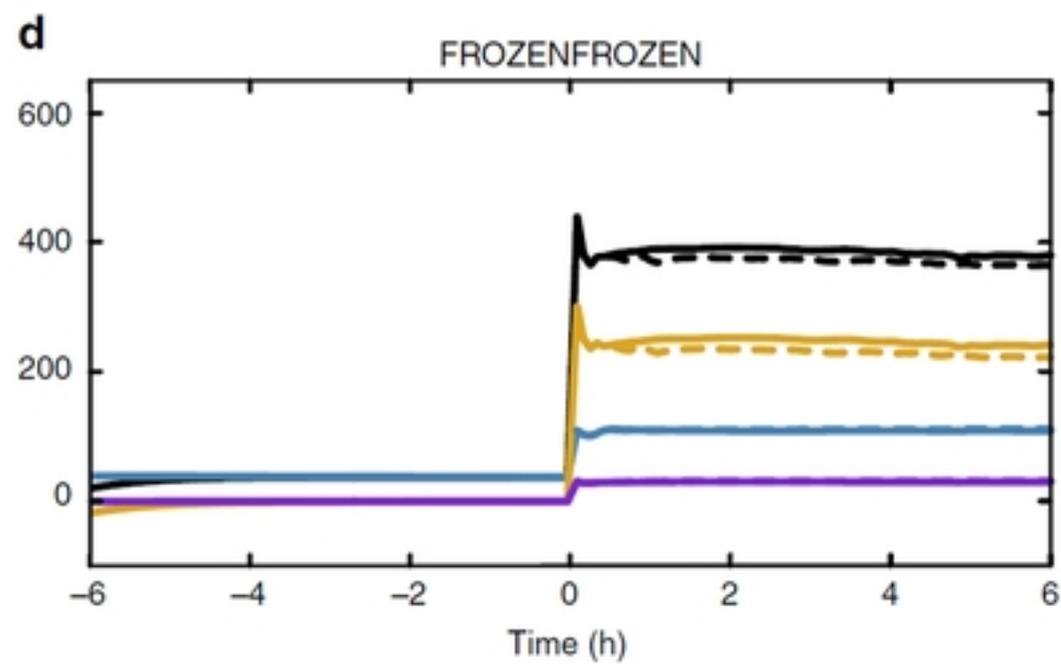
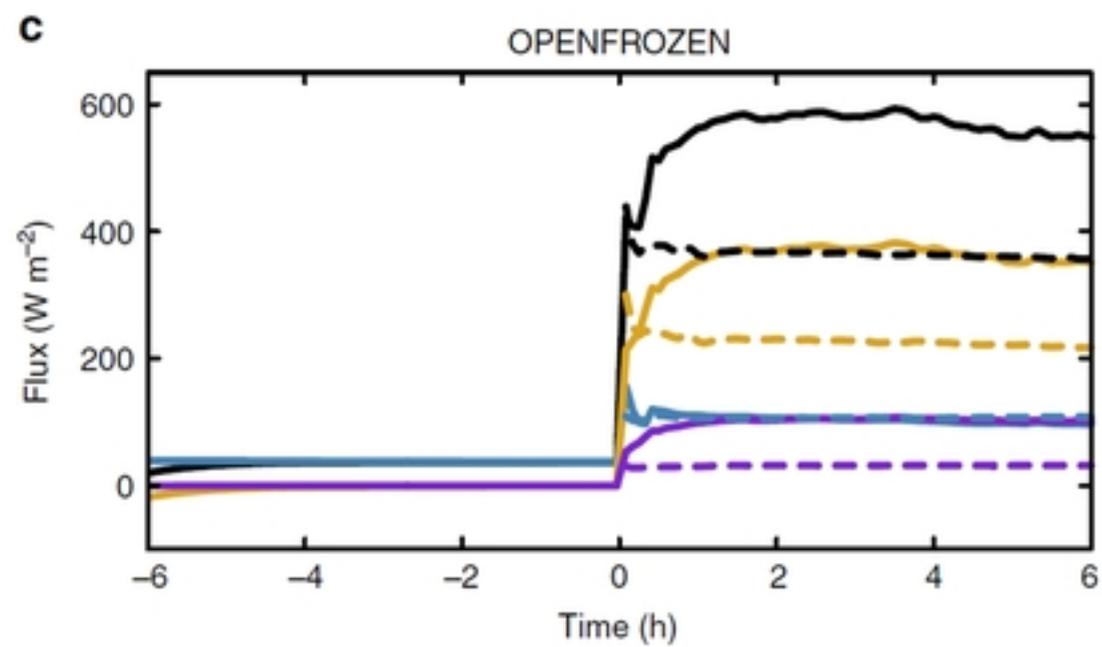
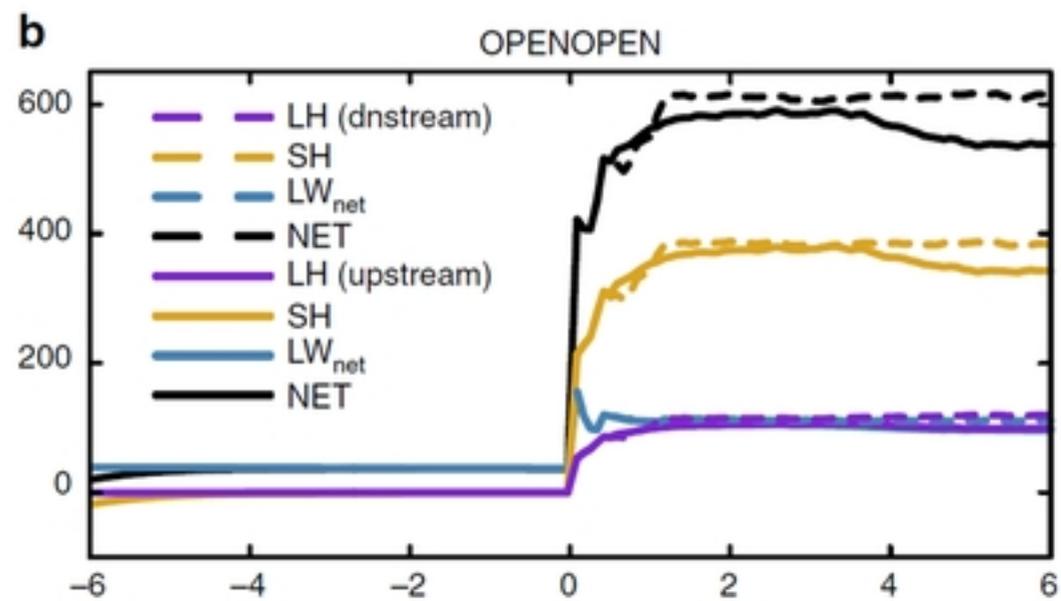
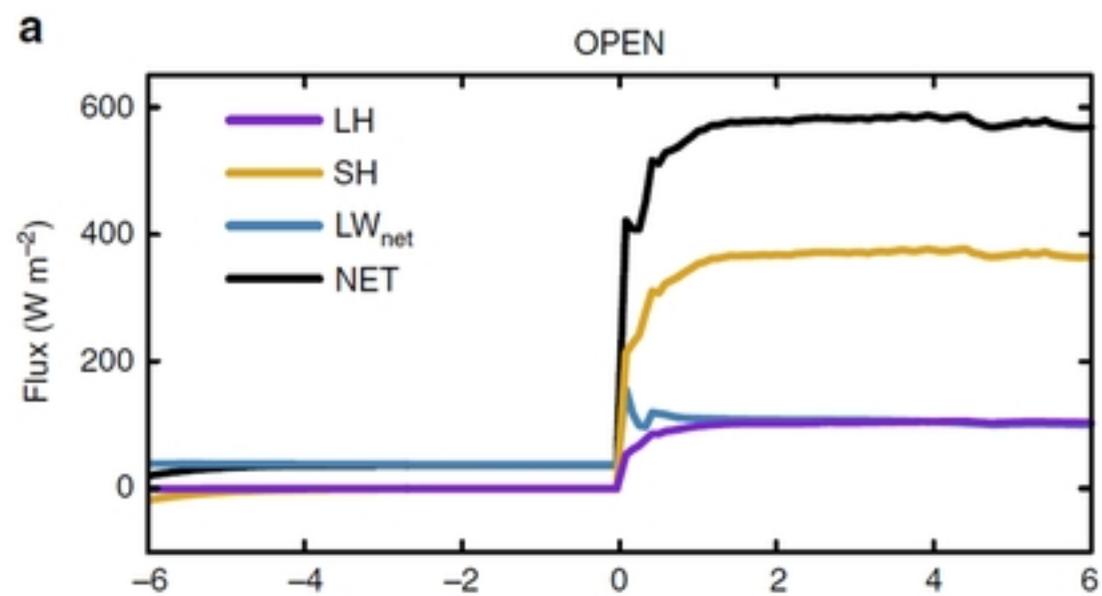


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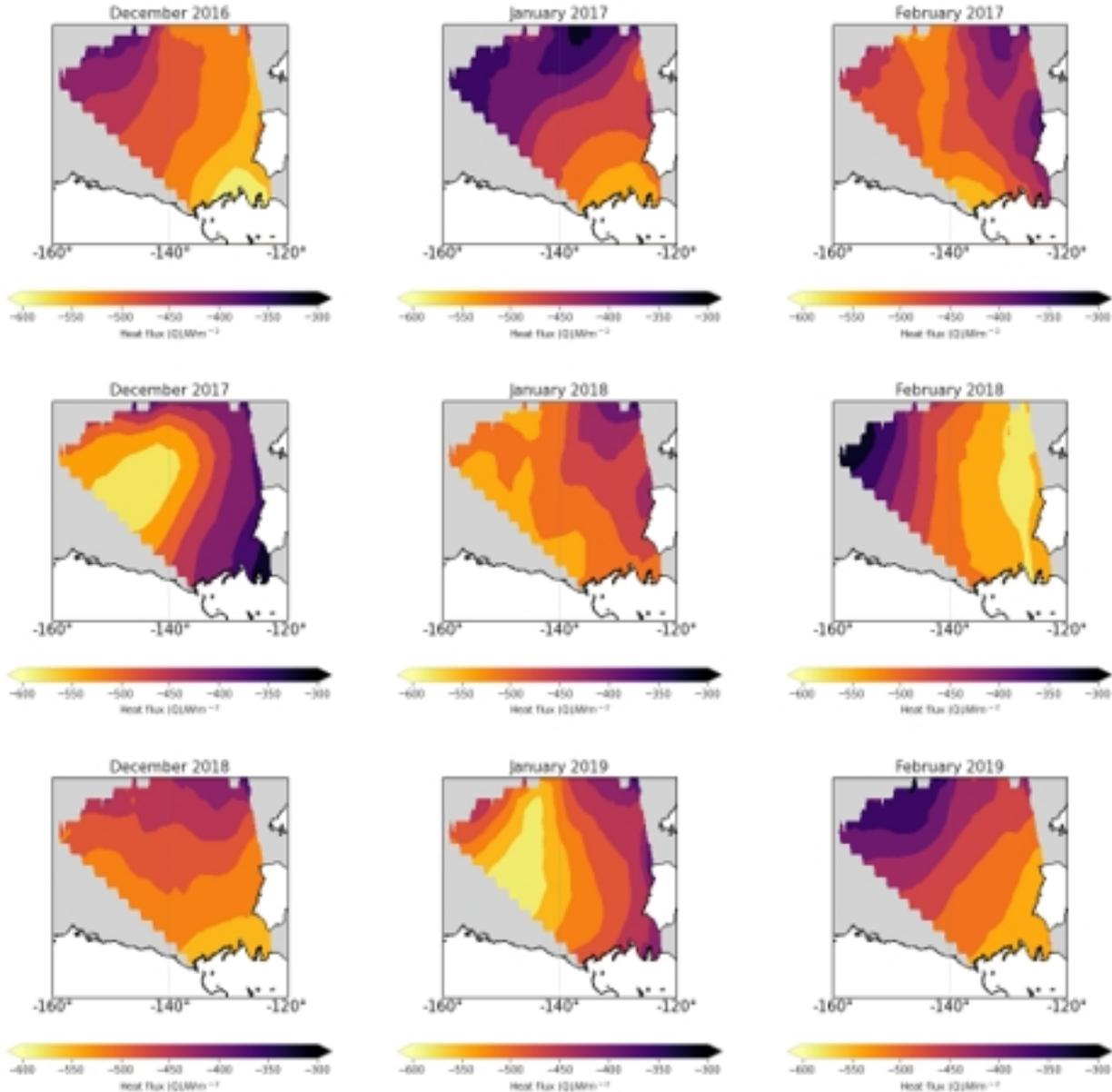
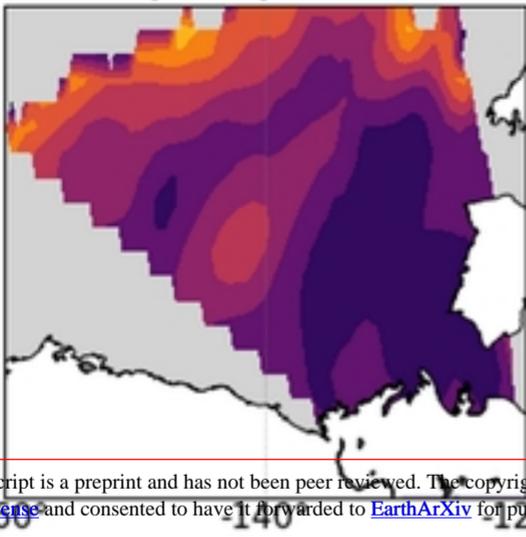
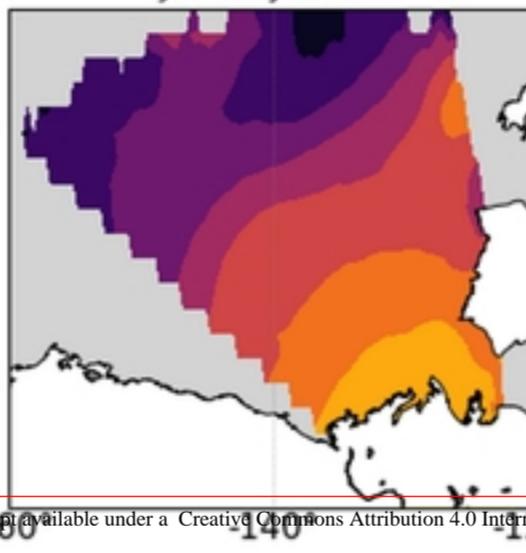


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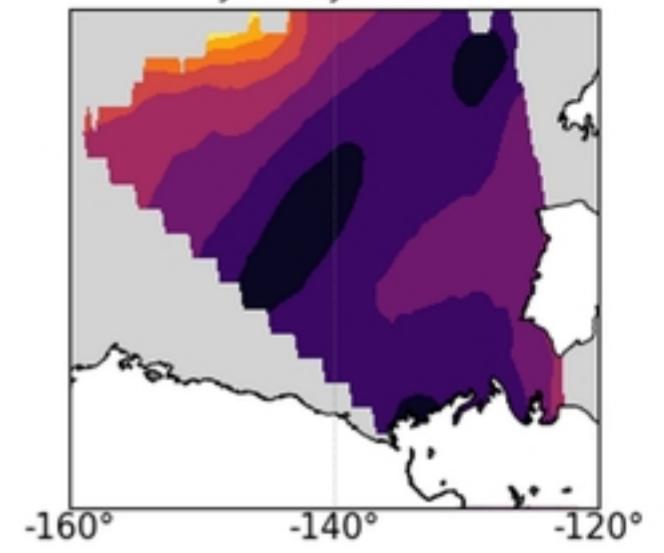
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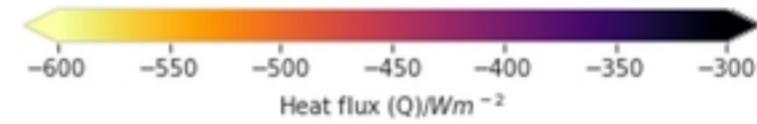
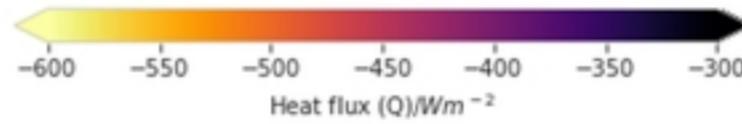
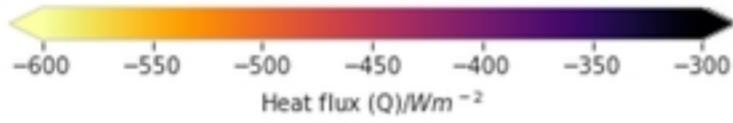
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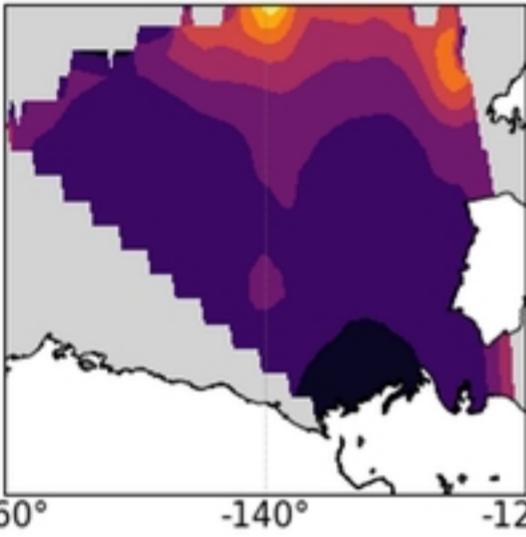
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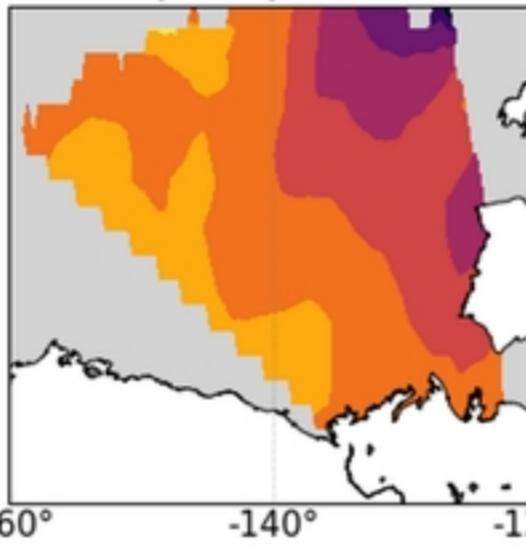
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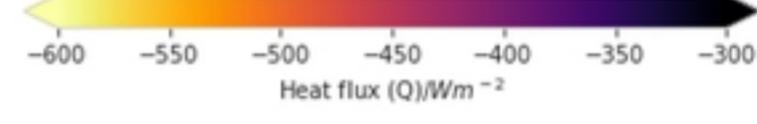
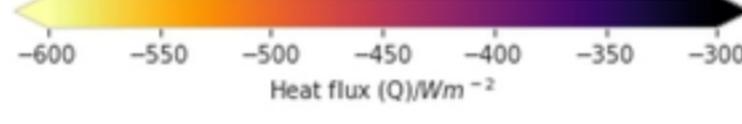
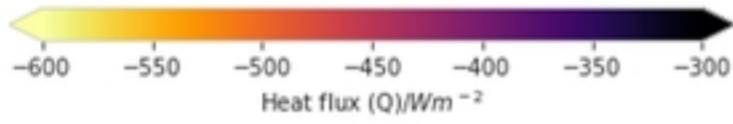
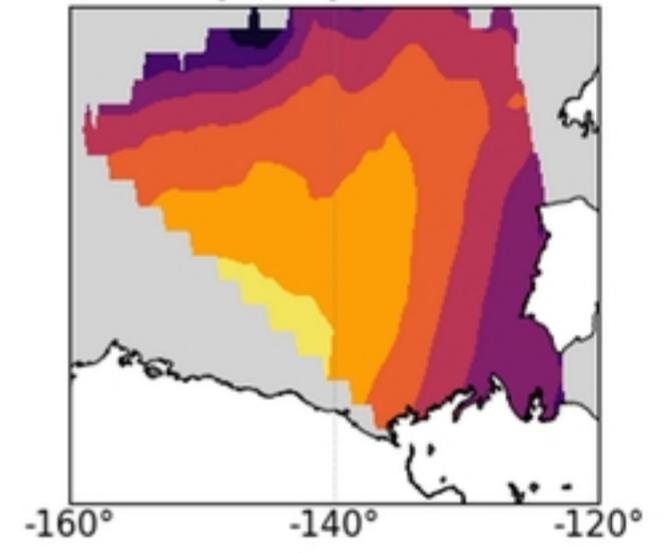
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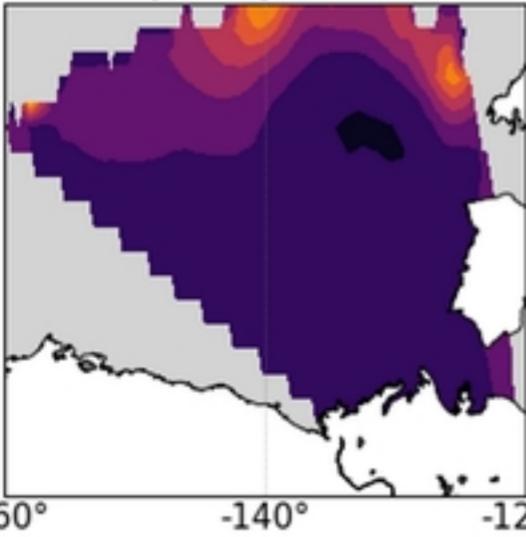
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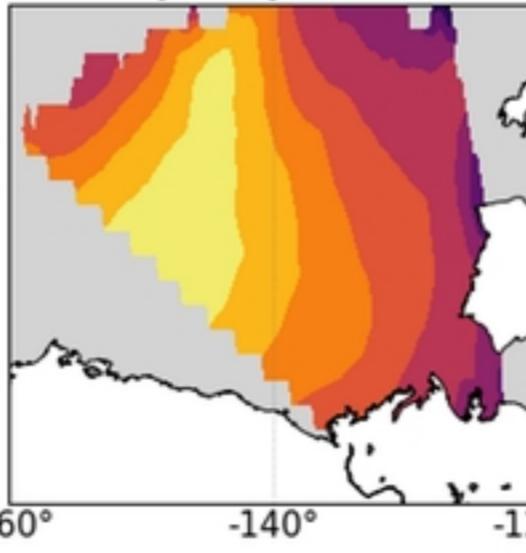
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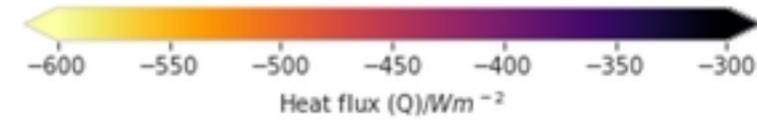
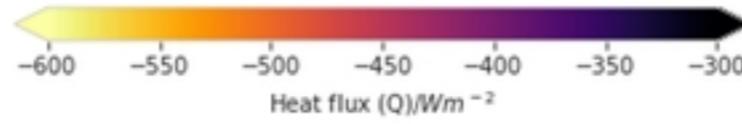
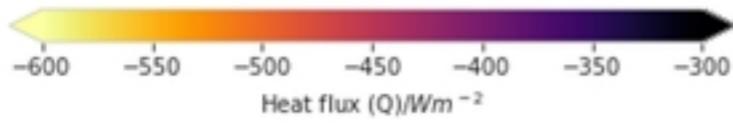
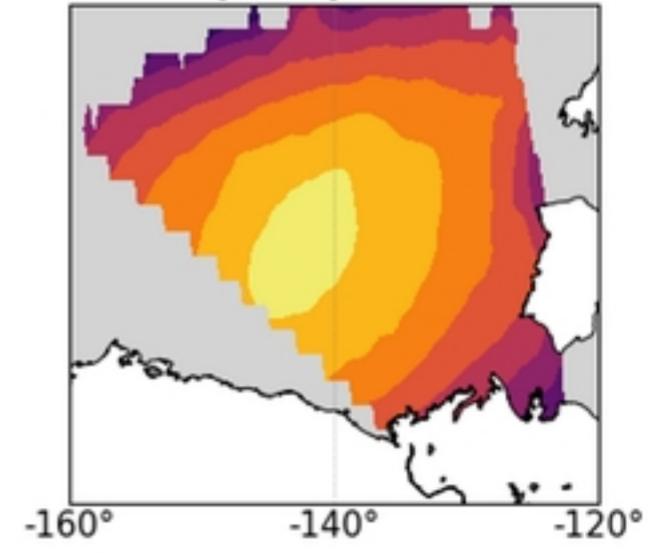
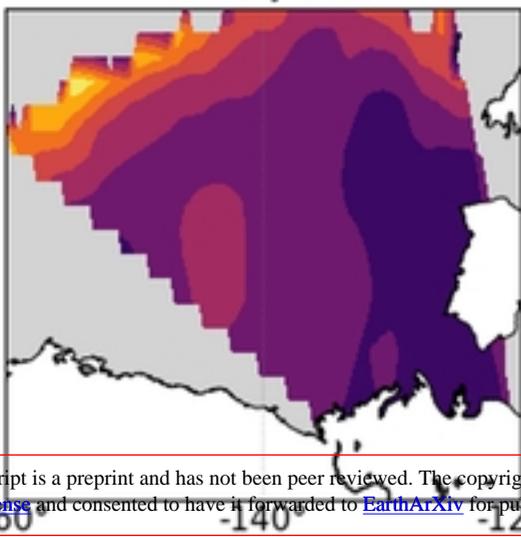
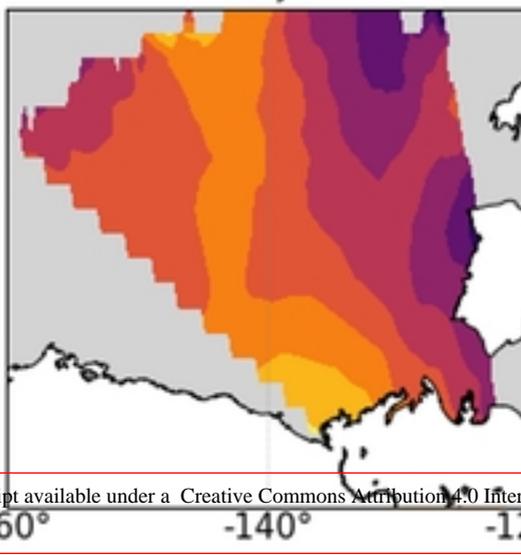


Figure4b

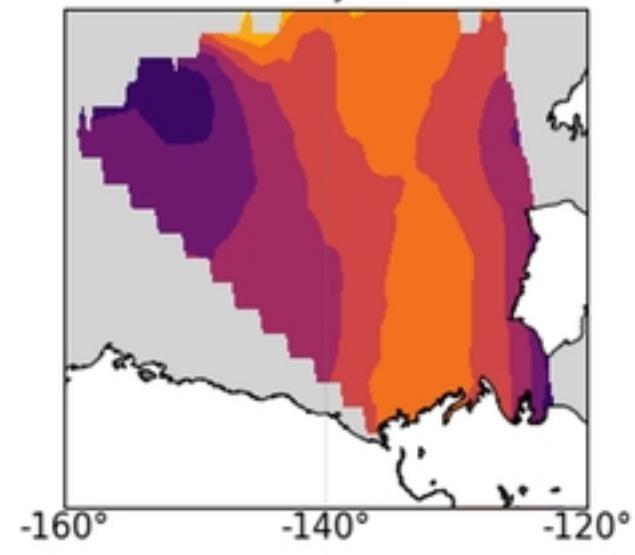
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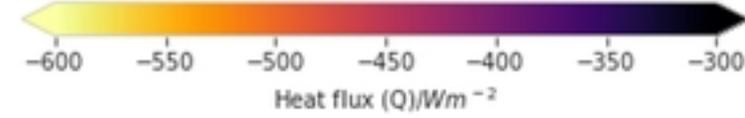
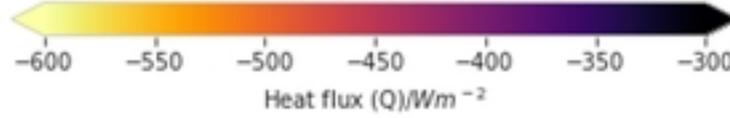
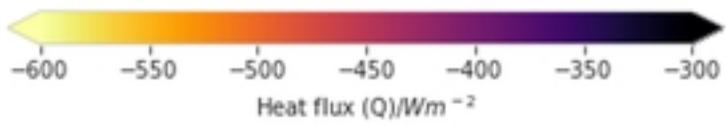
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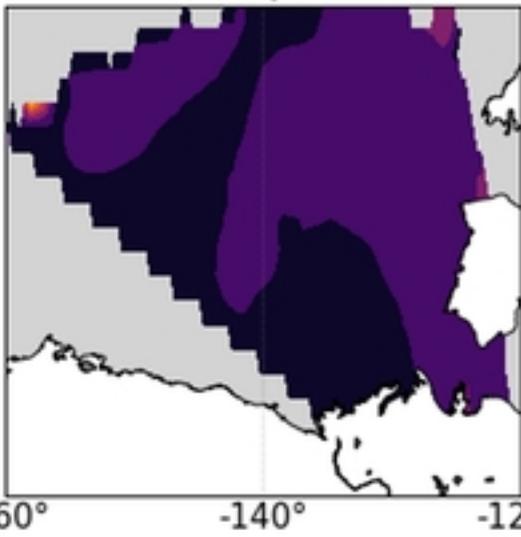
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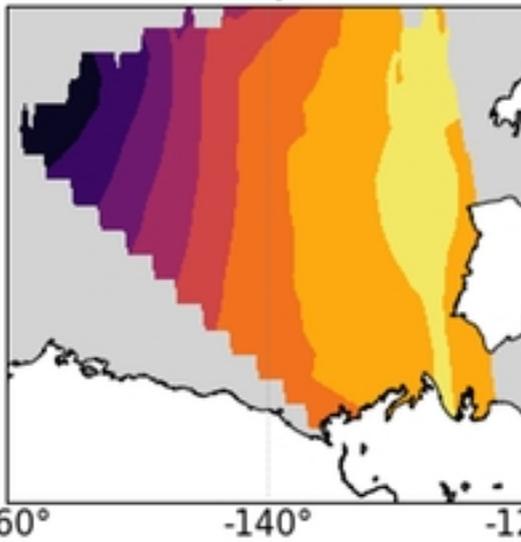
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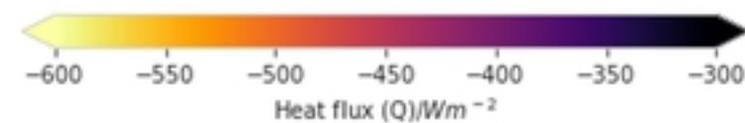
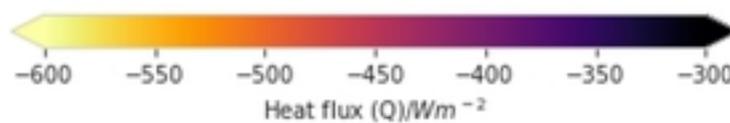
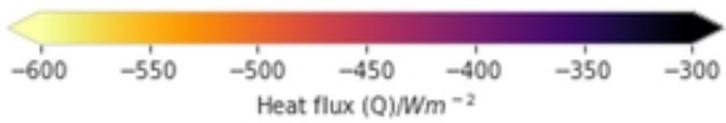
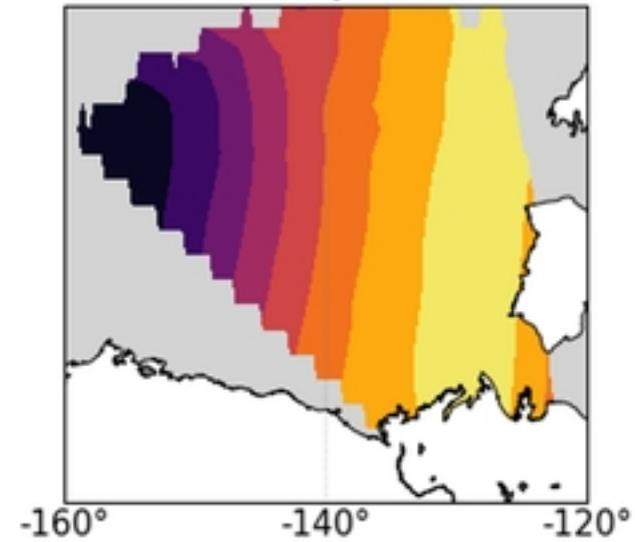
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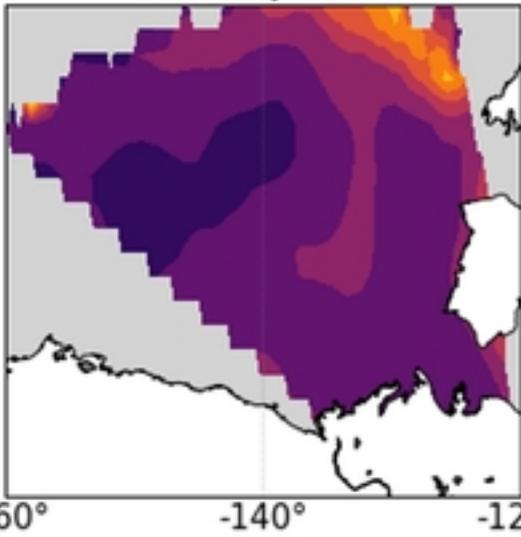
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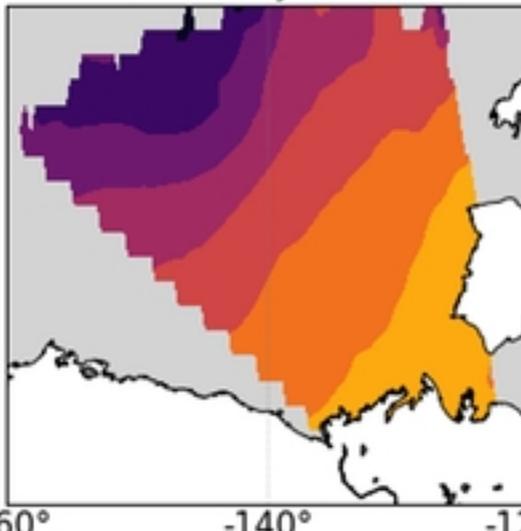
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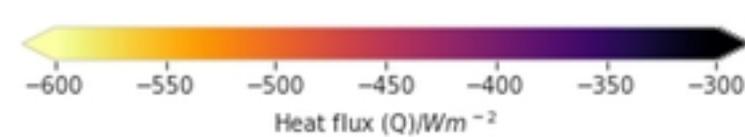
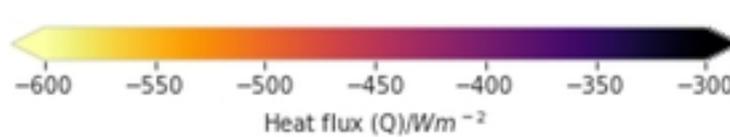
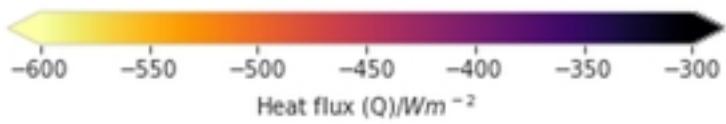
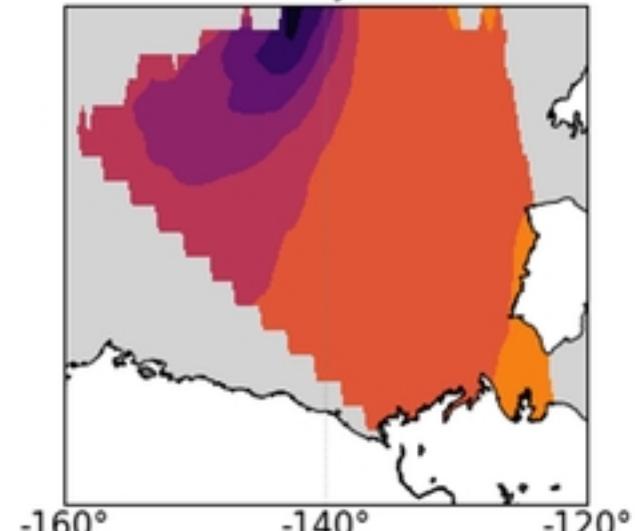


Figure4c

