



# The distribution and evolution of supraglacial lakes on 79° N Glacier (north-eastern Greenland) and interannual climatic controls

Jenny V. Turton<sup>1</sup>, Philipp Hochreuther<sup>1</sup>, Nathalie Reimann<sup>1</sup>, and Manuel T. Blau<sup>2,3</sup>

<sup>1</sup>Institute of Geography, Friedrich–Alexander University, 90154 Erlangen, Germany

<sup>2</sup>Department of Climate System, Pusan National University, Busan 46241, South Korea

<sup>3</sup>Centre for Climate Physics, Institute for Basic Science, Busan 46241, South Korea

**Correspondence:** Jenny V. Turton (jenny.turton@fau.de)

Received: 5 February 2021 – Discussion started: 2 March 2021

Revised: 7 July 2021 – Accepted: 15 July 2021 – Published: 20 August 2021

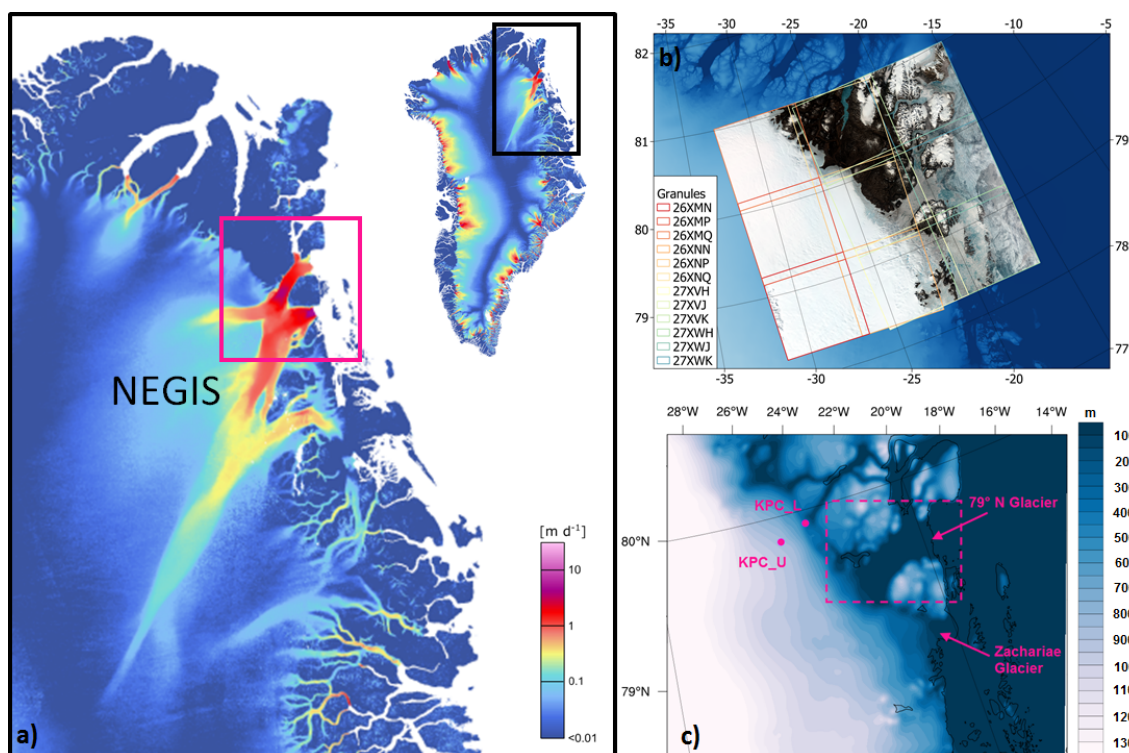
**Abstract.** The Nioghalvfjærdsfjorden glacier (also known as the 79° North Glacier) drains approximately 8 % of the Greenland Ice Sheet. Supraglacial lakes (SGLs), or surface melt ponds, are a persistent summertime feature and are thought to drain rapidly to the base of the glacier and influence seasonal ice velocity. However, seasonal development and spatial distribution of SGLs in the north-east of Greenland are poorly understood, leaving a substantial error in the estimate of meltwater and its impacts on ice velocity. Using results from an automated detection of melt ponds, atmospheric and surface mass balance modelling, and reanalysis products, we investigate the role of specific climatic conditions in melt onset, extent, and duration from 2016 to 2019. The summers of 2016 and 2019 were characterised by above-average air temperatures, particularly in June, as well as a number of rainfall events, which led to extensive melt ponds to elevations up to 1600 m. Conversely, 2018 was particularly cold, with a large accumulated snowpack, which limited the development of lakes to altitudes less than 800 m. There is evidence of inland expansion and increases in the total area of lakes compared to the early 2000s, as projected by future global warming scenarios.

ing it the largest discharger of ice in northern Greenland (Mouignot et al., 2015; Mayer et al., 2018). Prior to the 21st century, NEGIS, which extends 600 km into the interior of the GIS (Fig. 1), was believed to be stable, with little change in ice dynamics (Khan et al., 2014; Mayer et al., 2018). However, since 2006 NEGIS has undergone pronounced thinning of  $1 \text{ myr}^{-1}$ , and the floating tongue of 79° N has retreated by 2–3 km since 2009 (Khan et al., 2014). Recently, over  $100 \text{ km}^2$  of ice was lost through calving of a tributary glacier to 79° N Glacier, Spalte Glacier (Fig. S1 in the Supplement), following record-breaking summer air temperatures in 2019 and 2020, highlighting the vulnerability of this region to climate change and surface melt.

The surface of 79° N and the NEGIS feature persistent meltwater ponds, or supraglacial lakes (SGLs), and meltwater drainage channels (Fig. S1). SGLs are a frequent summertime feature on many glaciers in Greenland (Pope et al., 2016), on ice shelves (e.g. Larsen C; Luckman et al., 2014), and on sea ice (Perovich et al., 2002). The albedo of SGLs is between 0.1 and 0.6, depending on their depth (Malinka et al., 2018), and therefore they absorb much more shortwave radiation than the surrounding solid ice (Buzzard et al., 2018a). SGLs influence both the surface mass balance (SMB) and the dynamical stability of glaciers by lowering the albedo at the surface and draining water to the base, which reduces friction and influences ice flow velocity (Zwally et al., 2002; Vijay et al., 2019). Both ice velocity increases and decreases have been linked to the drainage of SGLs across Greenland. Short-lived velocity increases have been observed during summer in several marine-terminating glaciers, including 79° N Glacier (Rathmann et al., 2017).

## 1 Introduction

Nioghalvfjærdsfjorden, also known as 79° North Glacier (henceforth 79° N Glacier), is a marine-terminating glacier on the north-eastern coast of Greenland. Approximately 8 % of the Greenland Ice Stream (GIS) drains into 79° N Glacier through the North East Greenland Ice Stream (NEGIS), mak-



**Figure 1.** (a) Ice velocity ( $\text{m d}^{-1}$ ) of the north-east of Greenland with the North East Greenland Ice Stream (NEGIS) labelled (insert is the whole map of Greenland with ice velocities and a black box outlining the area in a). Pink box outlines the approximate area of (b) and (c). (b) The mosaic of Sentinel-2 granules used to apply the SGL detection algorithm, captured on 19 June 2019. The background is the GIMP DEM of Howat et al. (2014). (c) The inner domain of Polar Weather Research and Forecasting (PWRP) model simulations by Turton et al. (2020), with the locations of the two AWSs (KPC\_U and KPC\_L) and the elevation of the glacier and ice sheet in colour. The dashed pink box highlights the floating portion of the glacier. Ice velocity data from Sentinel-1, winter campaign from December 2019 to January 2021, from the ESA Ice Sheets CCI project (<http://products.esa-icesheets-cci.org/products/downloadlist/IV/>, last access: 20 June 2021).

Both Rathmann et al. (2017) and Vijay et al. (2019) hypothesise that the summer speed-up of 79° N Glacier occurs when SGLs drain to the base and alter the subglacial hydrology. Conversely, on land-terminating glaciers, SGL drainage has been shown to reduce ice velocity on the seasonal to decadal timescales (Sundal et al., 2011; Tedstone et al., 2015). SGLs are a key component of the SMB and yet rarely feature in mass balance models or estimates (Smith et al., 2017; Yang et al., 2019). Despite the high number of studies focusing on surface mass loss from the Greenland Ice Sheet (e.g. Lüthje et al., 2006; Das et al., 2008; Tedesco et al., 2012; Stevens et al., 2015), the relationship between SMB, runoff, and SGL development remains unclear.

Despite the widespread occurrence of SGLs, very few studies have investigated the relationship between the seasonal evolution of SGLs and the atmospheric processes required for their formation in this region. Previous studies have largely focused on Antarctic ice shelves (Langley et al., 2016; Arthur et al., 2020; Leeson et al., 2020) and southern and western Greenland (Lüthje et al., 2006; Das et al., 2008; Tedesco et al., 2012; Stevens et al., 2015). Recently, more northerly locations have been investigated, including Peter-

mann Glacier (Macdonald et al., 2018). Multispectral satellite products now provide observations of SGLs over north-eastern Greenland at both high temporal and spatial resolutions, and in many cases free of charge. The north-east of Greenland, and specifically the NEGIS region, has, until recently, lacked such detailed analysis of SGLs; however, this region is likely to show an inland expansion of SGL and ablation zones in the near future (Leeson et al., 2015; Igneczi et al., 2016; Noël et al., 2019). Sundal et al. (2009) used MODIS data to assess the lake area between 2003 and 2007 for 79° N Glacier amongst other locations. However, as the ASTER images were acquired at a later stage in the melt season, the percentage of unidentified lake area at the start of the summer is likely to be higher than 12 % (Sundal et al., 2009). Winter estimates of liquid water area on 79° N Glacier are also now available from Schröder et al. (2020). Recently, Hochreuther et al. (2021) developed an automated melt detection algorithm for Sentinel-2 satellite data. This provides a near-daily, 10 m spatial resolution time series of SGLs on the NEGIS during summertime.

Widespread summer melting was observed over Greenland in 2007, 2010, and 2012, which prompted research into

large-scale teleconnection patterns (Tedesco et al., 2013; Lim et al., 2016; Hanna et al., 2014a). These patterns of atmospheric variability have been found to influence the air temperature and precipitation in Greenland. The North Atlantic Oscillation (often termed NAO) is the dominant mode of variability for Greenland and the Arctic, defined as the “see-saw” of atmospheric surface pressure changes between Iceland and the Azores (Hildebrandsson, 1897; Hanna et al., 2014b). Three other modes of atmospheric variability were found to be important for specifically the north-east and east of Greenland by Lim et al. (2016): the Arctic Oscillation, the East Atlantic pattern, and the Greenland Blocking Index. Generally (for the whole of Greenland), a negative phase of the North Atlantic Oscillation and Arctic Oscillation is associated with a warm and dry atmosphere over the GIS and often leads to mass loss at the surface (Lim et al., 2016). Furthermore, a positive Greenland Blocking Index (especially when combined with a positive East Atlantic pattern and negative North Atlantic Oscillation index) also leads to positive temperature anomalies over the GIS. Extreme Greenland-wide melt seasons, such as in 2012, have been linked to specific teleconnection patterns (Tedesco et al., 2013); however, no studies have assessed the potential role of teleconnections in the development of SGLs or localised melt conditions.

Along with large-scale teleconnection influences, smaller-scale mesoscale processes also influence the climate and melting over Greenland. Recently, atmospheric rivers, or narrow filament-like regions of intense water vapour transport in the atmosphere, have been investigated in response to extreme surface mass balance variations in the north-west of Greenland (Bonne et al., 2015; Mattingly et al., 2018, 2020). In most cases, the north-east of Greenland, especially the coastal regions and marine-terminating glaciers, have received little or no attention during extreme melting years, possibly due to weaker teleconnection signals (Lim et al., 2016) or due to low spatial resolution data (Oltmanns et al., 2019). Similarly, prior to the mid-2010s, the majority of melting was located in the southern and western parts of Greenland, leading to vast research for these regions (e.g. van de Wal et al., 2005, 2012; Tedstone et al., 2017; Kuipers Munneke et al., 2018). However, after the mid-2010s, the highest melt anomalies were located in northern Greenland, especially in 2014 and 2016 (Tedesco et al., 2016). Recently, a low-permeability ice slab was identified in north-eastern Greenland and within 79° N Glacier (MacFerrin et al., 2019). The metres-thick, englacial layers of refrozen meltwater enhance melting and runoff processes and are sustained with relatively small amounts of meltwater from drainage of SGLs (MacFerrin et al., 2019). With a warming climate, it is likely that the ice slabs will become more widespread and persistent, although more research is required to investigate the glaciohydrology in these regions. In a recent review paper, Flowers (2018) highlighted that further investigation into surface meltwater volume, drainage, and runoff from marine-terminating glaciers is required.

The specific aims of this study are to investigate (1) the spatial distribution of SGLs over 79° N Glacier, (2) the life cycle of lake development, (3) the atmospheric and topographic controls on melt pond evolution in the north-east of Greenland between 2016 and 2019, and (4) whether and how conditions have changed since the Sundal et al. (2009) study in the early 2000s. To accomplish this, we use a combination of Sentinel-2 data, high-resolution (1 km) atmospheric modelling output from the Polar Weather Research and Forecasting (PWRF) model, surface mass balance estimates from the COSIPY model, as well as in situ observations.

In Sect. 2, we introduce the automatic detection algorithm and data used in the study, followed by the results (Sect. 3). These are separated into topographic (Sect. 3.2) and climatic (Sect. 3.3) controls of the SGL formation and spatial distribution. The discussion continues in Sect. 4 and the research concludes in Sect. 5.

## 2 Data and methods

### 2.1 Automated SGL detection algorithm

Automatic SGL detection algorithms have previously been applied to a number of satellite records, including MODIS (Sundal et al., 2009), Landsat8 (Williamson et al., 2018), Sentinel-1 (Schröder et al., 2020), and Sentinel-2 (Williamson et al., 2018; Hochreuther et al., 2021). A previously developed SGL detection algorithm by Hochreuther et al. (2021) has been applied to Sentinel-2 data between March and September 2016–2019 for melt pond tracking. For a full description of the processes involved in SGL detection, see Hochreuther et al. (2021); however, a brief overview is provided here. Optical imagery is collected from two twin satellites, Sentinel-2 A and B, at a revisit duration of approximately 1–2 d at this latitude and a spatial resolution between 10 and 60 m. Whilst launched in 2015, data coverage was too low over the study area to extract a meaningful time series of SGLs. Therefore, the time series used here runs from 29 March 2016 to 19 September 2019.

An empirically developed and locally tuned static band ratio threshold for the blue to red band spectra was applied. This approach was chosen over the often-applied NDWI due to faster computation and expected similar results (Williamson et al., 2017; Hochreuther et al., 2021). To delineate ice and slush from liquid water, thresholds between 1.0 and 2.4 were tested and compared visually to true colour images, resulting in a best fit at a ratio of 1.6. After the application of the threshold, the images were cropped to the grounded ice. The GIMP land classification map (Howat et al., 2014), updated by a Sentinel-2 image from 2016 and combined with an ERS-2 SAR-based grounding line estimation, was used to delineate the eastern ice margin (Hochreuther et al., 2021). Sieving the binary mask, again with iterative size testing in advance, reduced noise stem-

ming from crevasse and serac fields, retaining only water areas larger than 150 pixels ( $0.015 \text{ km}^2$ ). This potentially causes a number of very small lakes to be missed but represents the best possible compromise between falsely removing small lakes and falsely retaining misclassifications due to shadows or slush. A topographic shadow mask was applied to the data to avoid misclassifications. Furthermore, as lakes on the Greenland Ice Sheet have been shown to form mainly within topographic sinks, only water areas within topographic depressions were retained using a digital elevation model (DEM)-based sink mask, reducing the risk of identifying streams as lakes. Finally, a two-step cloud detection was applied, taking changes in lake area over time (step 1) and cloud (shadow) size into account. Depth and volume were not estimated, as no measurements of lake depths exist for similar latitudes (and thus solar zenith angles) within the observation period of Sentinel-2. Additionally, lakes on 79° N Glacier have been shown to partially be significantly deeper than in western Greenland (see Neckel et al., 2020, and the discussion section). As a consequence, spectrum-depth equations derived in other studies could not be applied here.

Lakes are not automatically detected on the floating tongue portion of the glacier. Firstly, there are no topographic sinks, as these are reliant on a DEM of the grounded ice sheet. Secondly, the tongue is fast moving (approximately  $1500 \text{ m a}^{-1}$ ; Krieger et al., 2020), which makes it difficult to track the lake outlines from one year to the next. Finally, meltwater on the tongue is extensive and flows in more linear patterns as it drains through crevasses (Fig. S1). Description of the SGLs on the floating tongue throughout the paper reflect only visual inspection of the satellite images.

## 2.2 In situ observations

Observational data at two AWSs located on Kronprins Christian Land (KPC) in the north-east of Greenland are used from the PROMICE (Programme for Monitoring of the Greenland Ice Sheet) network (<https://www.promice.dk>, last access: 3 April 2019) operated by the Greenland and Denmark Geological Survey (GEUS). AWS KPC\_U (upper) is located at  $79.83^\circ \text{ N}$ ,  $25.17^\circ \text{ W}$ ,  $870 \text{ m a.s.l.}$  and KPC\_L (lower) is located at  $79.91^\circ \text{ N}$ ,  $24.08^\circ \text{ W}$ ,  $370 \text{ m a.s.l.}$  (Fig. 1). See Table 1 and Turton et al. (2019a) for more information on data availability and the climatology of this region.

## 2.3 Reanalysis data

The European Centre for Medium-Range Weather Forecasts (ECMWF) 5th generation reanalysis product ERA5 has been developed to replace the ERA-Interim product. ERA5 was gradually released starting in July 2017 and back to 1979 is now available. The horizontal resolution of ERA5 is approximately  $31 \text{ km}$  and has 137 levels in the vertical from the surface to a height of  $0.01 \text{ hPa}$ . Total precipitation and snowfall have been extracted from ERA5 at hourly intervals from the

nearest grid point to the coordinates of the AWS. The ratio of snowfall to total precipitation (SF/TP) is then calculated. Total precipitation and snowfall estimates from ERA5 were compared to observations taken from buoy measurements in the Arctic Ocean by Wang et al. (2019) and found to have a high degree of agreement with observations. The high resolution of ERA5 was also desirable compared to other available reanalysis products in the region (Turton et al., 2019a).

## 2.4 Polar Weather Research and Forecasting model

Archived model output from the PWRF model (v3.9.1.1) is analysed. Meteorological variables are available at daily temporal and  $1 \text{ km}$  spatial resolutions from Turton et al. (2019b) at <https://doi.org/10.17605/OSF.IO/53E6Z>. PWRF is a polar-optimised version of the WRF model to better account for sea ice and snowpack processes (Hines et al., 2015). The majority of adjustments in PWRF compared to regular WRF are located in the Noah land surface module. The model output has been previously evaluated against the in situ PROMICE weather stations near 79° N Glacier and can successfully represent a number of near-surface meteorological variables for both daily mean and sub-daily timescales (Turton et al., 2020). The full description and justification of the model setup are provided in Turton et al. (2020) and the inner domain location is presented in Fig. 1a. Data are available from October 2013 to December 2018.

## 2.5 COSIPY mass balance model

To provide an overview of the surface mass balance (SMB) of the region, output from a distributed, open-source SMB model called COSIPY (COupled Snowpack and Ice surface energy and mass balance model in PYthon) (<https://github.com/cryotools/cosipy>, last access: 17 August 2021; Sauter et al., 2020) is used. Hourly,  $1 \text{ km}$  spatial resolution surface mass balance simulations from COSIPY, forced with 4-D PWRF output for 2014 to 2018, are used here (COSIPY-WRF). COSIPY-WRF SMB outputs were evaluated against available observations and compared to previous studies by Blau et al. (2021) and found to represent the majority of SMB components with reasonable success at the grounding line and inland for 79° N Glacier. Archived output from COSIPY-WRF is available at <https://doi.org/10.5281/zenodo.4434259>. Here, we use surface mass balance estimates from September 2015 to August 2018 to place our melt pond findings in the context of the wider melt in the region. For a full list of parameterisations and a description of COSIPY, see Blau et al. (2021).

**Table 1.** Location, elevation, and data availability of KPC\_L and KPC\_U AWSs. Observations are taken approximately 2 m above the surface.  $T_a$  is air temperature,  $SW_{in}$  and  $LW_{in}$  are the incoming (downward) shortwave and longwave radiation respectively, and TSK is the skin temperature of the glacier. See van As and Fausto (2011) for more information on observations from the PROMICE network.

Name	Location	Elevation (m a.s.l.)	Data availability	Variables used in this study
KPC_L	79.91° N, 24.08° W	380	1 January 2009–present	$T_a$ , cloud cover; TSK $SW_{in}$ , $LW_{in}$
KPC_U	79.83° N, 25.17° W	870	1 January 2009–14 January 2010, 18 July 2012–present	$T_a$ , cloud cover; TSK $SW_{in}$ , $LW_{in}$

### 3 Results

#### 3.1 Interannual characteristics

Here, we highlight the important lake characteristics and analyse the climatic and topographic controls responsible for the spatial and temporal distribution of SGLs on 79° N Glacier, as detected by Hochreuther et al. (2021) from 2016 to 2019. The average size of individual SGLs varies interannually from a maximum of 0.07 km<sup>2</sup> in 2016 to 0.02 km<sup>2</sup> in 2018.

Typically, lake development began in early June at the lowest elevations. Total lake area increased throughout June and July, reaching a peak in the first week of August. Throughout July, the rate of increase was steady, with approximately 20 %–25 % increase in lake area from one observation to the next, in all years (Fig. 2). From mid-August (days 220–230), the daily change rate became negative as SGLs froze up or drained. However, in some years there were still individual days of increasing SGL area (positive change rate) punctuating the overall decline in SGL area towards the end of the melt season (Fig. 2). This occurred due to periods of warm air temperature or late-season rainfall events. SGLs which remained at the end of the melt season (and have not drained into the firn or channels) typically froze over or became buried in snow. Freeze-over of lakes started with a growing floe on one side or with a “lid” in the centre and froze outwards (Fig. 3). In years with low snow accumulation at the start of September, the frozen, semi-spherical remains of frozen lakes can still be seen.

The rate of increase in SGL area varied interannually (Fig. 2). The years 2016 and 2019 were characterised by fast increases in SGL area in June (days 150 to 170–180). In 2016, the increasing rate of SGL area regularly exceeded 100 % increase in total SGL area from one observation to the next (Fig. 2). June 2017 had a relatively steady increase in SGL area, with approximately 25 % daily increases in area. June 2018 was characterised by a seesaw pattern in expansion of lake area, with periods of fast increases in area (approximately 50 % daily increases), followed by periods of SGL lake closure (Fig. 2). Sustained expansion of lake area only occurred after the last week of June for 2018. Closure

or freeze-over of lakes at the end of the melt season was later and slower in 2018 than in 2016, 2017, and 2019 (Fig. 2), and some lakes even remained open at the end of the observation period in mid-September.

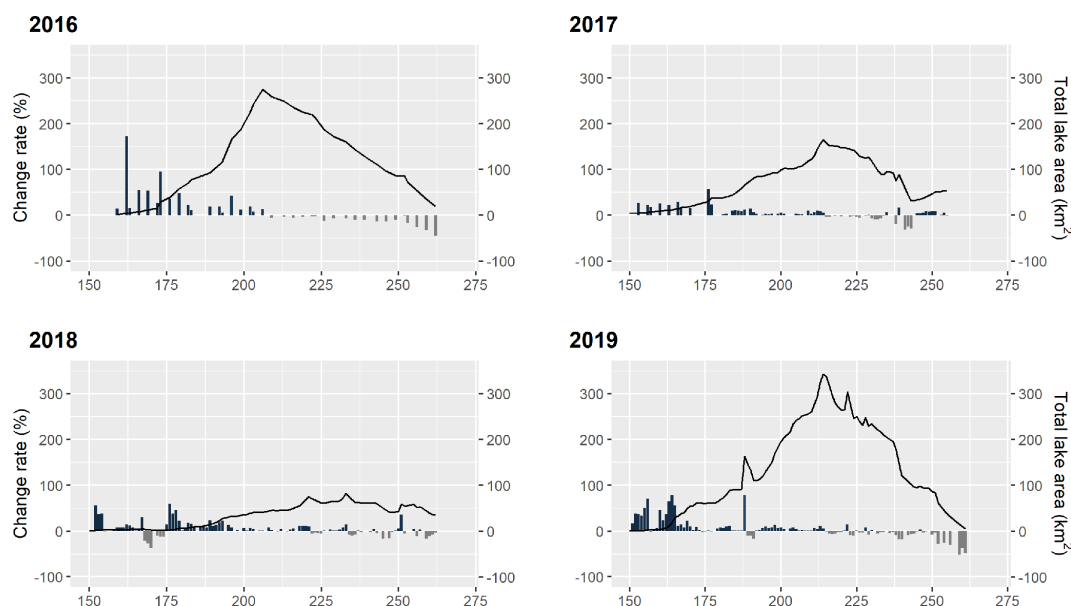
Similarly to the rate of change, the total SGL area varied interannually. The largest peak total SGL area was seen in 2019, with 330 km<sup>2</sup> (Fig. 2). Conversely, the smallest peak total SGL area was in 2018 with just 77 km<sup>2</sup> (Hochreuther et al., 2021). This is approximately a 329 % increase between maximum lake area in 2018 and in 2019. The spatial difference in the years is shown in Fig. 3, where considerably more lakes are highlighted in 2016 and 2019 than in either 2017 or 2018. Whilst this only shows a snapshot of conditions on 2 different days, representing peak conditions (mid-July; blue) and a period when the SGLs freeze up (mid-August; pink), the spatial distribution of the lakes differs by years. SGLs at elevations greater than 800 m are detected across much of the glacier in 2016 and 2019 but only sparsely in 2017 and 2018 (Figs. 3 and 4). Similarly, much larger SGLs are open in 2016 and 2019 than the other 2 years (Fig. 3). The peak total SGL area in 2016 and 2019 was considerably larger than in 2017 and 2018, especially at altitudes from 1000 to 1600 m a.s.l. (Fig. 4). However, in years with a lower total SGL area, such as 2018, the distribution of lakes is skewed more towards lower elevations (Fig. 4c).

#### 3.2 Topographic controls

Melt lakes are part of the whole drainage system of ice sheet hydrology. Given sufficient meltwater availability, the location of lake formation is foremostly controlled by the topography of the ice sheet surface (Lüthje et al., 2006). Lakes therefore act as a sink for the englacial channels which distribute the water across and through the ice sheet. The position of lakes on the Greenland Ice Sheet is therefore largely controlled by the underlying bedrock topography (Lampkin and Vanderberg, 2011).

Below the grounding line of 79° N Glacier (on the floating tongue), the lakes advect downstream with the flow of the glacier towards the ocean, in a similar fashion to those observed on Petermann Glacier (Macdonald et al., 2018). However, above the grounding line, lakes develop in the same de-





**Figure 2.** Change rates of the lake area between observations from 2016 to 2019, limited to DOY 150–270 (bars, in percent of the last observed area). Line graph: total lake area in km<sup>2</sup>.

pression or location each year (Fig. 3). The SGL area in 2016 and 2019 is larger compared to 2017 and 2018. This interannual change in SGL area is due to the inland expansion of lakes to higher elevations (Fig. 3), as opposed to the development of new lakes at lower elevations.

The minimal SGL area between approximately 200 and 600 m (Fig. 4) is partly a consequence of higher slope angle. The slope of the glacier surface between these altitudes is approximately 3° to 4°. The areas with larger SGL area and where the largest lakes develop (Fig. 3) are between 0.6° and 1.5° (Fig. 4). Unlike some of the ice shelves in Antarctica, where SGLs are concentrated around the grounding line due to low elevation and slope (Arthur et al., 2020), on 79° N Glacier, SGLs are also clustered at higher altitudes, where low slope angles are also measured. Consequently, the largest lakes can be found at altitudes between 850 and 1000 m. The highest elevation of SGL development was at 1600 m in 2019 (Fig. 4). Due to the flat terrain, these lakes are, judging from the blue spectrum saturation, comparatively shallow, whereas the lakes close to the grounding line appear smaller in area but deeper (Fig. S2 in the Supplement).

Significant decreases in total lake area can be attributed either to sudden climatic changes or to consecutive drainage events. In 2019, the sudden decrease around DOY 240 is attributed to a large freeze-over of the majority of all lakes above 700 m a.s.l. Conversely, the decrease following the 2019 peak of total lake area on 2 August (DOY 214) was caused by a stepwise drainage pattern, starting with larger lakes at high altitudes, followed by drainage events close to the ice front of Zachariae and accompanied by a speedup of calving and seawater movement (Fig. S3 in the Supplement).

Because of the timing and sequence of the rapid drainage events, we can deduce a subglacial meltwater reconfiguration in this case.

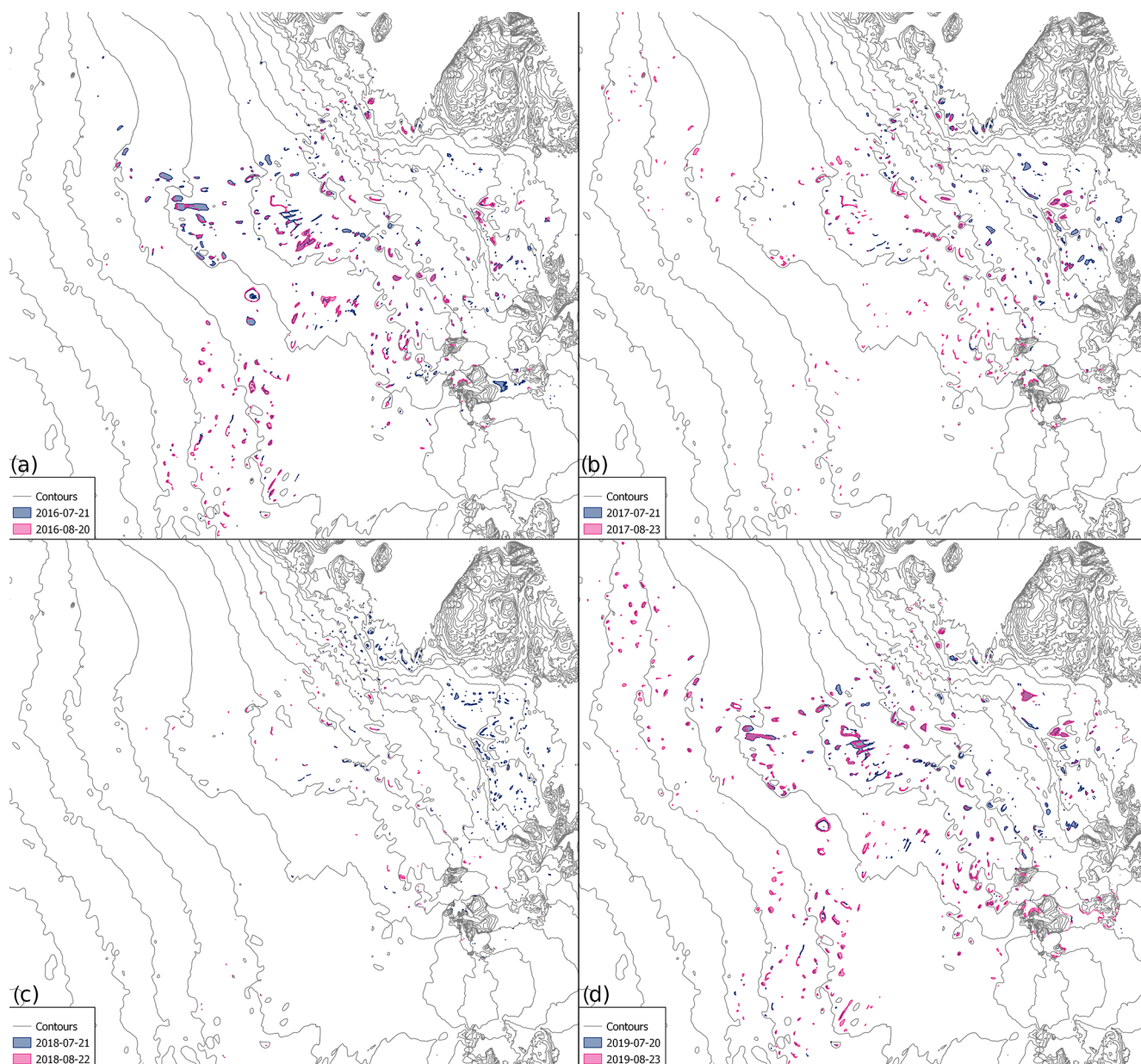
### 3.3 Climatic controls

Whilst the location of the individual lake is controlled by topographic features, whether or not the lake will develop is due to atmospheric conditions. In conjunction with the topographic controls, the second-most important control for lake development is the availability of meltwater, which is largely controlled by the weather conditions. We have assessed numerous atmospheric variables for the 4-year period in an attempt to investigate the relationship between these variables and the melt onset and extent.

Buzzard et al. (2018a) investigated the impact of varying atmospheric variables in an idealised 1-D melt pond model and identified that near-surface air temperature ( $T_a$ ), skin (or surface) temperature (TSK), shortwave incoming radiation (SWin), and snowfall (SF) had a considerable impact on the development of SGLs. We investigate these variables in conjunction with rainfall following the findings of Oltmanns et al. (2019). Other previously investigated variables which had little to no influence on SGL development include wind speed and non-climatic variables such as wet-snow albedo (Buzzard et al., 2018a), which we do not investigate.

#### 3.3.1 Air temperature ( $T_a$ )

The average summer (JJA)  $T_a$  is 0.7°C over the floating tongue of the glacier, decreasing to −1.2°C at an elevation of 830 m a.s.l. observed at KPC\_U AWS (Turton et al.,

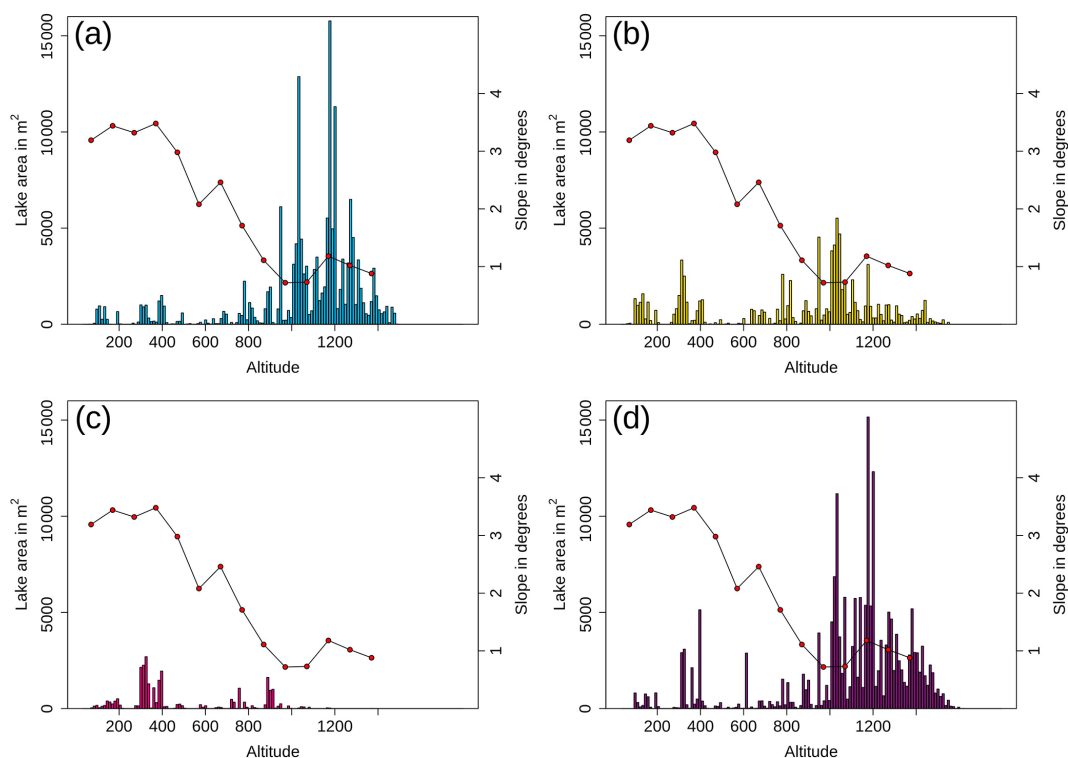


**Figure 3.** Lake area in July (blue) and August (purple) for 2016 (a), 2017 (b), 2018 (c), and 2019 (d). Contours are every 100 m. Lakes on the tongue have been removed to assess only those controlled by topography.

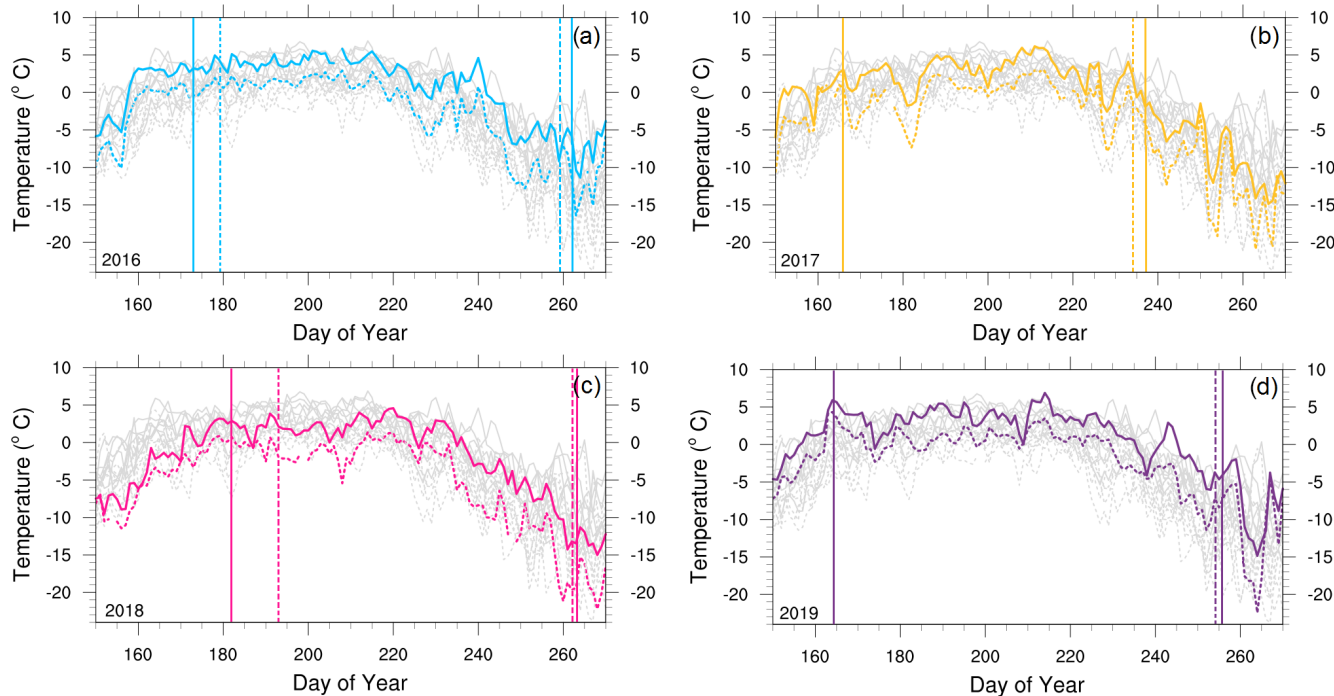
2019a). The average June, July and August air temperatures at KPC\_L (KPC\_U) are 1.1 °C (−2.1 °C), 3.6 °C (0.7 °C) and 0.5 °C (−2.6 °C) respectively (see Fig. 1 for AWS locations). Typically (from 2009 to 2019), the daily average  $T_a$  reaches 0 °C in the second week of June at approximately 390 m a.s.l. (KPC\_L location) and late June at 830 m a.s.l. (KPC\_U location) (Table 2). From this date until mid-August, the daily air temperatures are often at or just above the melting point (Fig. 5).

In 2016, all 3 summer months observed above-average  $T_a$  at both observation sites. At higher elevations, daily  $T_a$

reached 0 °C slightly earlier than usual (11 June 2016), after a cooler than average start to June, especially at KPC\_U (Fig. 5a). Rather than a gradual increase in air temperatures throughout the start of June, there was a marked jump in temperature between 5 and 11 June 2016 (Fig. 5a). At KPC\_U the temperature increased from −10.1 °C on 5 June to 0.9 °C on 11 June and then remained above or close to freezing (0 °C ± 0.75 °C) until mid-August (Fig. 5a). Just 16 d after this temperature jump, SGL formed at elevations of approximately 870 m a.s.l. (elevation of KPC\_U) (Table 2; Fig. 5a). There were 84 d (70 of which were consecutive) with above-



**Figure 4.** Altitude distribution of lake area for the maxima of 2016 (a), 2017 (b), 2018 (c), and 2019 (d) per 10 m altitude difference. Red dots show average slope angle for 100 m altitude bins.



**Figure 5.** The daily air temperature observations from KPC\_L (solid line) and KPC\_U (dashed line) from days of the year 150 to 270 for (a) 2016, (b) 2017, (c) 2018 and (d) 2019. Grey lines are daily air temperature from 2009 to 2019 (when available). Vertical solid (dashed) lines represent the opening and closing of SGLs at KPC\_L (KPC\_U) approximate elevations (information from Table 2).



zero daily  $T_a$  in 2016 at KPC\_L (Table 2). The longest consecutive period with above-average air temperatures at both KPC\_L and KPC\_U, from observations between 2009 and 2019, was during 2016. The average June 2016  $T_a$ , simulated by PWRf, was above freezing for large parts of the NEGIS region (Fig. 6a). Spatially, these higher air temperatures approximately follow the 800 m contour line, showing some agreement with the altitude–temperature relationship. However, the July 2016 average air temperatures deviate from this relationship, with warmer air temperatures above 1200 m for 79° N Glacier but remaining below 800 m near Zachariae and to the south of the glacier (Fig. 7a). Average July 2016  $T_a$  above 3 °C is simulated for large parts of the NEGIS. At KPC\_L, July 2016 was 3.2 °C warmer than average, agreeing well with the PWRf data.

The earliest observation of above-zero daily  $T_a$  (from 2009 to 2019) was 27 May 2017 at KPC\_L. However, air temperatures rapidly decreased again at the end of May 2017 before reaching 0 °C on 1 June 2017 (Fig. 5b). Both June and August 2017 average air temperatures at both observation sites were slightly below average, but the July average temperature was 0.5 °C (0.2 °C) warmer than the 2009–2019 average at KPC\_L (KPC\_U). Despite the lower June  $T_a$  in 2017 compared to 2016, the length of time between  $T_a$  reaching above 0 °C at KPC\_L and development of melt ponds at 370 m a.s.l. was also 14 d (Table 2; Fig. 5b). However, at higher altitudes, there were only 5 d between  $T_a$  above 0 °C and melt ponds developing at 870 m a.s.l. in 2017 (Table 2; Fig. 5b). The cooler air temperature in 2017 relative to the previous summer is evident over the majority of the NEGIS, with above-average  $T_a$  locations restricted to low-elevation pockets (Fig. 6b). The average 2017  $T_a$  is spatially more similar to the 2016 situation in July (Fig. 7). In July 2017,  $T_a$  greater than 0 °C was simulated over much of 79° N Glacier, up to elevations greater than 1000 m a.s.l. Lower-elevation regions and areas of seasonally exposed rocks reached a daily average  $T_a$  of 3 °C (Fig. 7b). At higher elevations, the earliest closure of SGLs within the 4-year period was observed in this year (1 September 2017 at 870 m a.s.l.), which was approximately 10 d after the  $T_a$  dropped below freezing at KPC\_U (Fig. 5b). Similarly, at lower elevations, 2017 saw the earliest SGL closure of the 4-year period on 12 September, 18 d after  $T_a$  dropped below freezing at KPC\_L (Table 2; Fig. 5b).

The smallest total SGL area and latest lake development were observed in 2018. The latest observed onset of warm air temperatures was also in 2018, when the first recorded above-zero daily  $T_a$  was on 20 June 2018 (Fig. 5c; Table 2). This is also evident in the later onset of SGLs at both lower and higher elevations (Fig. 5c; Table 2). The first 2 weeks of June 2018 were colder than in any other year in the last decade of observations (Fig. 5c). This is also reflected in the much colder June average  $T_a$  over the NEGIS region from the PWRf 2018 simulations (Fig. 6c). All 3 summer months in 2018 were characterised by considerably cooler air temperatures over the area of interest, with above-freezing tempera-

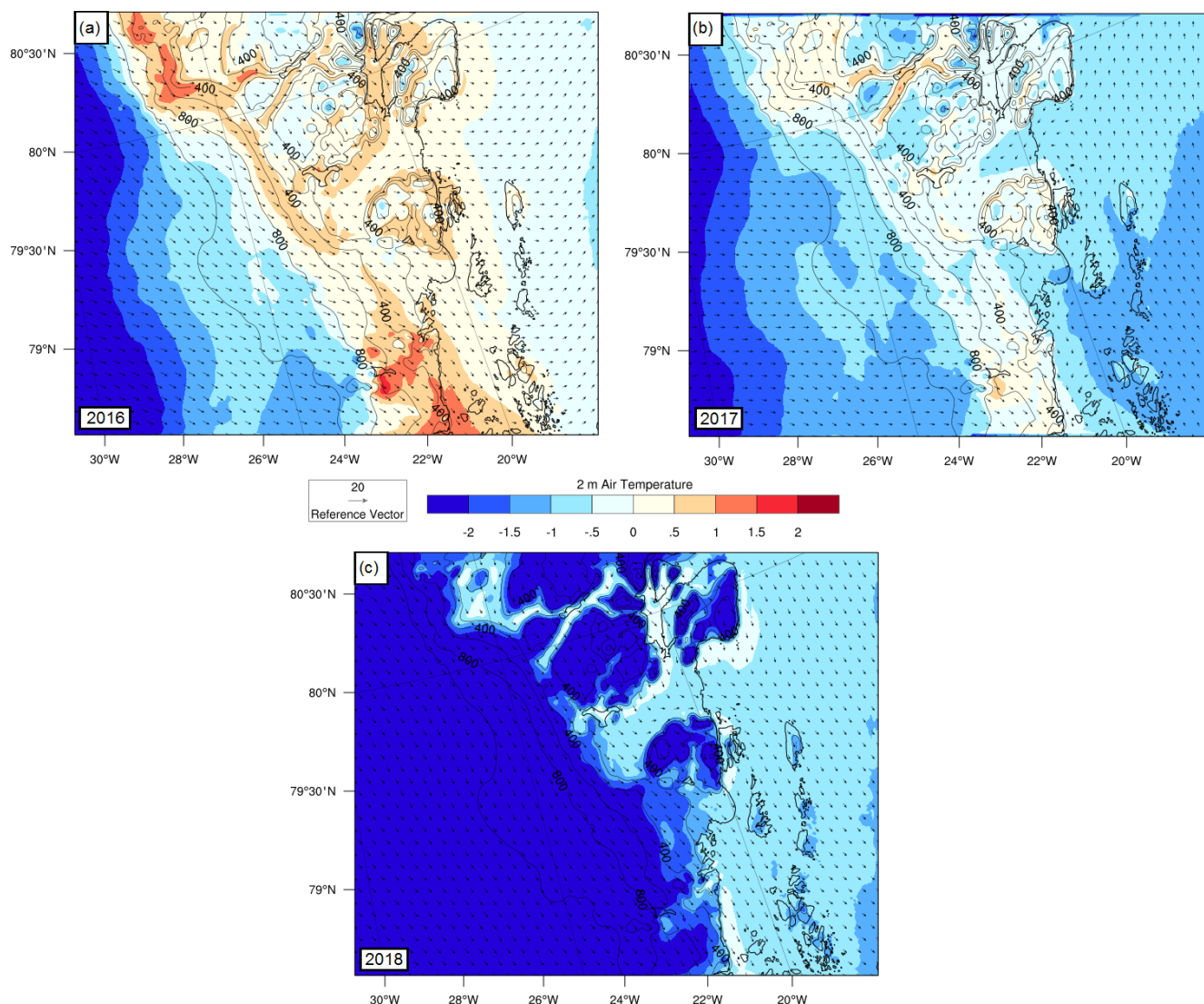
tures restricted to very low-lying parts of the glacier during July (Fig. 7). June and July 2018 were both 2.0 °C cooler than average at both observation locations. Both the number of days above freezing and the consecutive number of days above freezing were both at their lowest in 2018 (Table 2), with just 8 consecutive days above freezing at KPC\_U. In August 2018,  $T_a$  increased and was close to average conditions throughout August (Fig. 5c). The last day with  $T_a$  above freezing was observed on 25 August 2018 at KPC\_L, the same as in 2017 (Table 2). However, the latest observation of SGLs at 370 m a.s.l. was 18 September 2018, the latest in the 4-year period, and SGLs were still visible at the end of the observational period (Table 2; Fig. 5c).

At lower elevations, the conditions in summer 2019 were remarkable. At both KPC\_L and KPC\_U, air temperature records were broken in June 2019 (Fig. 5d), along with most areas of the ice sheet (Tedesco and Fettweis, 2020). There were 115 d of  $T_a$  greater than 0 °C, with 61 of those being consecutively observed at KPC\_L in 2019 (Table 2). Similarly, warm  $T_a$  continued past the summer season, with the final observation of  $T_a$  above 0 °C on 28 September 2019 (Table 2). On 12 June 2019, a new daily air temperature record was set at KPC\_U of 4.2 °C, swiftly broken by a new daily record on 13 June of 4.3 °C. Prior to these two days, the highest temperature had been during the record-breaking summer of July 2012. Similarly, an hourly maximum of 7.9 °C was recorded at KPC\_U, which is the highest hourly temperature observation in a decade. Despite a warm start to the season, air temperatures returned to normal for the remainder of June and July. A second peak temperature event was recorded in early August 2019. The highest daily air temperature record at KPC\_L (between 2009 and 2019) of 6.9 °C was observed on 2 August 2019. The spatial distribution of the  $T_a$  in summer 2019 is not analysed as PWRf simulations are not available for this period. However, satellite images reveal extensive surface melt pond formation and very thin and broken sea ice, and a 50 km<sup>2</sup> calving event of Spalte Glacier was also recorded this year (Fig. S1). When taken altogether, these characteristics point to particularly warm temperatures across the whole region in 2019. SGL development started earlier in 2019 than in 2016 despite both years observing  $T_a$  above 0 °C at a similar time (6 June 2019 and 7 June 2016) (Table 2; Fig. 5a and d).

### 3.3.2 Skin temperature (TSK)

When daily average TSK is at 0 °C, the term TSK<sub>melt</sub> is used in this paper to represent likely surface melting. At KPC\_L, the average (2009–2019) melt day onset is 18 June, whereas at KPC\_U this date is 28 June. The average number of days with TSK<sub>melt</sub> is 44 at KPC\_L and 12 at KPC\_U. The average number of consecutive TSK<sub>melt</sub> days is 21 at KPC\_L and 5 at KPC\_U.

In terms of the skin temperature of the glacier at the KPC\_L location, 2016 stands out. The largest number of



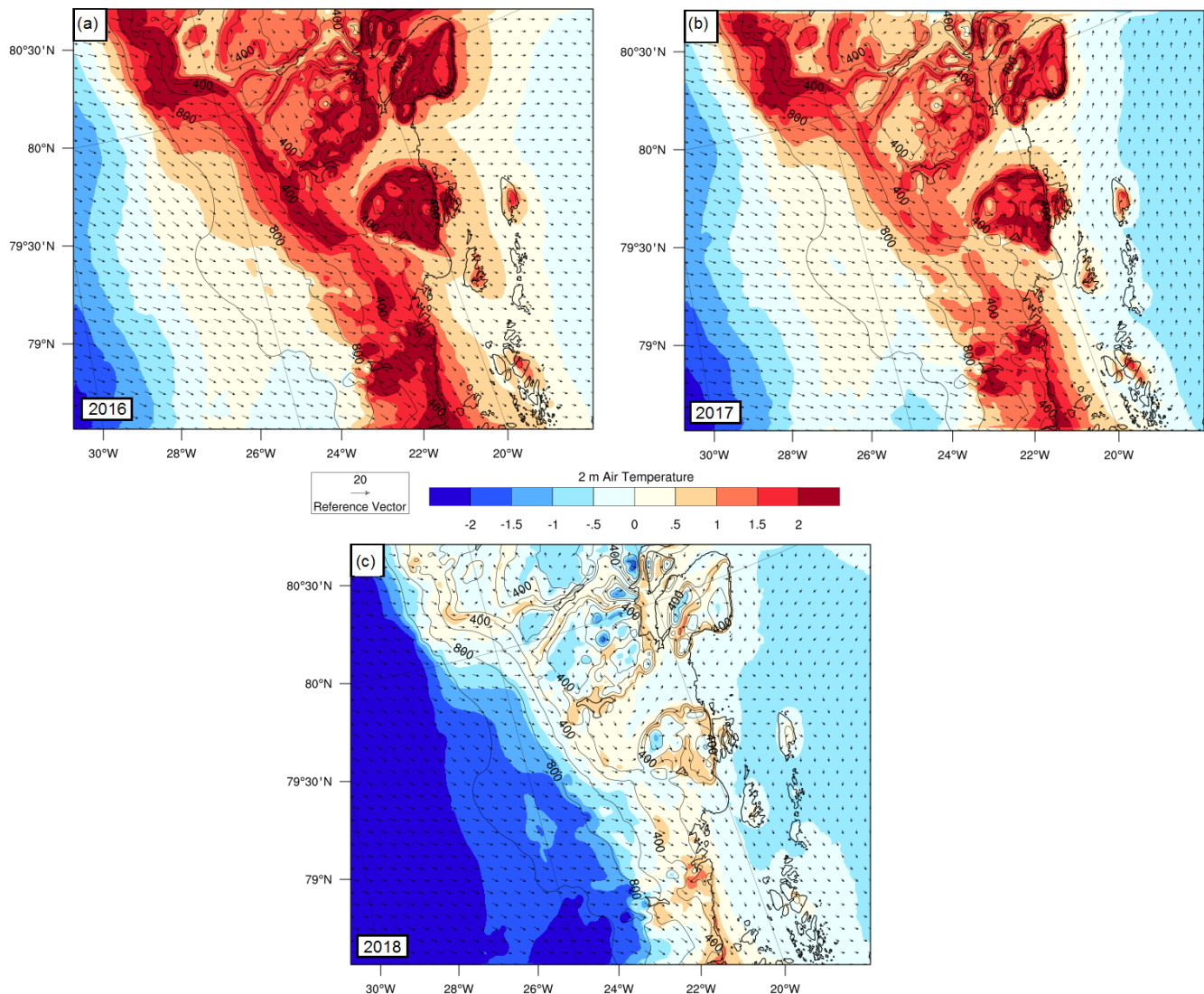
**Figure 6.** The monthly average 2 m air temperature from PWRP runs for June 2016 (a), 2017 (b) and 2018 (c). Simulations were not available for 2019. Contours are every 200 m, with labels every 400 m. Black arrows are wind vectors displaying monthly average wind direction and speed, with a reference vector of  $20 \text{ ms}^{-1}$  provided.

$\text{TSK}_{\text{melt}}$  days and longest number of consecutive  $\text{TSK}_{\text{melt}}$  days were observed in 2016 (64 d, of which 47 were consecutive). Similarly, the earliest onset of  $\text{TSK}_{\text{melt}}$  in the 4-year period was observed at KPC\_L in 2016, on 9 June. At KPC\_U, the number of  $\text{TSK}_{\text{melt}}$  days and consecutive  $\text{TSK}_{\text{melt}}$  days were also above average for 2016; however, the onset of surface melt was later than usual (1 July). Not only was this a standout year at KPC\_L from the 4-year study period, but also in the observational record from 2009. Even the record-breaking melt year of 2012 had fewer  $\text{TSK}_{\text{melt}}$  days and consecutive melt days.

The year 2017 was a relatively average melt season in terms of  $\text{TSK}_{\text{melt}}$ . The onset of  $\text{TSK}_{\text{melt}}$  at KPC\_L was on 13 June (only 5 d earlier than average), and there were 46  $\text{TSK}_{\text{melt}}$  days, of which 17 were consecutive. At KPC\_U, the

melt onset was earlier than average (10 June), but the number of  $\text{TSK}_{\text{melt}}$  days and consecutive melt days were lower than average (9 and 3 d respectively). The latest melt onset date was observed in 2018 at both locations: 26 June at KPC\_L (8 d later than average) and 3 August at KPC\_U (36 d later than average). At KPC\_U, only 1 d observed  $\text{TSK}_{\text{melt}}$  and only 30 d (13 consecutive) experienced  $\text{TSK}_{\text{melt}}$  at KPC\_L. Therefore, the shortest melt duration and latest melt onset at both locations were observed in 2018.

The year 2019 has a distinct spatial characteristic in terms of  $\text{TSK}_{\text{melt}}$ . At lower elevations, the number of  $\text{TSK}_{\text{melt}}$  and consecutive  $\text{TSK}_{\text{melt}}$  days are below average (27 and 17 respectively). However, at higher elevations, melting is above average with 17  $\text{TSK}_{\text{melt}}$  days, of which 6 were consecutive. At KPC\_U,  $\text{TSK}_{\text{melt}}$  onset was also earlier than aver-



**Figure 7.** The monthly average 2 m air temperature from PWRP runs for July 2016 (a), 2017 (b) and 2018 (c). Simulations were not available for 2019. Contours are every 200 m, with labels every 400 m. Black arrows are wind vectors, displaying monthly average wind direction and speed, with a reference vector of 20 ms<sup>-1</sup> provided.

age. Despite the above-average  $T_a$  at PKC\_L and KPC\_U in 2019, only above-average TSK conditions were observed at KPC\_U.

### 3.3.3 Incoming shortwave radiation (SWin)

In 2016, June and July both experienced positive biases in SWin at both observation sites. At KPC\_L, the SWin was 7.3 and 16.7 Wm<sup>-2</sup> higher than average for June and July (respectively). At KPC\_U, a positive bias of 10.2 Wm<sup>-2</sup> during June and 6.4 Wm<sup>-2</sup> in July was observed in 2016. There was also a positive bias of 17.3 and 7.5 Wm<sup>-2</sup> observed in July 2017 (KPC\_L and KPC\_U respectively). This increase in SWin observed at the surface is attributed to less cloud cover in the region. Cloud cover (fraction) at the KPC sta-

tions is estimated from downwelling longwave radiation and air temperature (both of which are observed) (Van as 2011). There was a reduction in cloud cover fraction in June, July and August in 2016 at both locations. The average summer cloud cover fraction at both locations is 0.4, whereas in 2016 it was 0.3. The reduced cloud cover is further evident in the Sentinel images, with many more clear-sky days over the NEGIS in 2016 than 2017 or 2018.

The SWin was lower than average at both observation sites in June 2017 (−2.6 Wm<sup>-2</sup> at KPC\_U and −10.5 Wm<sup>-2</sup> at KPC\_L). There was a positive bias in SWin of 17.3 and 7.5 Wm<sup>-2</sup> observed in July 2017 (KPC\_L and KPC\_U respectively), revealing clear skies in July. At lower elevations, this positive bias continued into August, with a monthly av-

erage bias of  $6.7 \text{ Wm}^{-2}$  at KPC\_L. However, at KPC\_U, a negative bias of  $-8.5 \text{ Wm}^{-2}$  was observed.

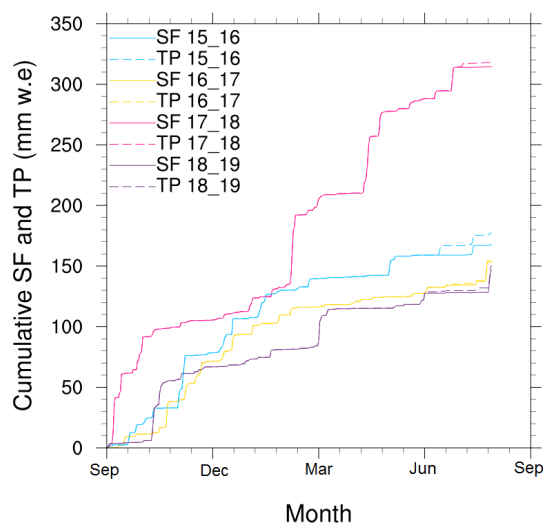
Despite the cooler conditions at both locations in summer 2018, positive biases in SWin were observed at both locations in July and August. The July SWin average was  $32.7$  and  $18.4 \text{ Wm}^{-2}$  higher than the 2009–2019 average at KPC\_L and KPC\_U respectively. Similarly, the August SWin positive bias was  $18.9 \text{ Wm}^{-2}$  at KPC\_L and  $17.3 \text{ Wm}^{-2}$  at KPC\_U. Higher-than-average cloud cover in June ( $0.45$  compared to  $0.36$  at KPC\_U) and lower-than-average cloud cover in July and August provide further evidence of clearer skies in the mid to late summer. The positive SWin and average temperatures towards the end of summer 2018, together with a considerable amount of liquid water from the melted snowpack, likely provided optimal conditions for the later peak in maximum SGL area and slower freeze-over of the lakes, with many still remaining open at the end of the observational period in September 2018 (Table 2).

Some of the largest anomalies of SWin were observed in summer 2019, with KPC\_L and KPC\_U observing monthly negative anomalies of  $-30.0$  and  $-19 \text{ Wm}^{-2}$  respectively for June, despite the high temperatures. Conversely, July saw opposite anomalies, with large positive anomalies in SWin at both KPC\_L ( $+35.4 \text{ Wm}^{-2}$ ) and KPC\_U ( $+34.3 \text{ Wm}^{-2}$ ). Similarly, the July average cloud cover was considerably below average, with a value of  $0.24$  compared to an average of  $0.36$  at KPC\_U. A persistent high-pressure system was responsible for the early-season temperature and melt increases seen over the whole ice sheet (Tedesco and Fettweis, 2020). However, increased cloudiness observed in the north-east of the ice sheet (and also simulated by Tedesco and Fettweis, 2020) also contributed to the early melt onset in June.

### 3.3.4 Total precipitation (TP) and snowfall (SF)

As precipitation is not observed at the KPC stations, we have used ERA5 data. Following Wang et al. (2019), a high ratio of snowfall to total precipitation can be inferred as more snow, whereas a low ratio means more precipitation fell as rain than snow. Between September 2015 and May 2016 (accumulation period),  $160 \text{ mm}$  of cumulative snowfall fell at the KPC\_U location. The ratio of snowfall to total precipitation was  $1.0$ , meaning that all precipitation fell as snow. However, during summer 2016, especially July and August, some rainfall is present in the region (Fig. 8). In July 2016, all  $7.7 \text{ mm}$  of cumulated precipitation was liquid rain (ratio of  $0$ ), and in August, the ratio was  $0.82$  with  $1.9 \text{ mm}$  of rainfall. For the whole summer period (JJA), the ratio was  $0.5$ . Even though the summer was therefore relatively dry, there was still a larger amount of summer rainfall in 2016 than in other years.

Total accumulated snowfall between September 2016 and May 2017 at KPC\_U was approximately  $130 \text{ mm w.e.}$ , which is the second-lowest total amount in our 4-year period of in-



**Figure 8.** The cumulative total precipitation (TP) and snowfall (SF) from September (beginning of the accumulation season) to August (end of the melt season) at the KPC\_L location from ERA5.

terest (Fig. 8). The summer (JJA) 2017 snowfall to total precipitation ratio was  $0.96$ , highlighting the minimal rainfall in this year: the smallest rainfall total in the 4-year period.

The largest amount of cumulated snowfall during the accumulation period (September to May) occurred in 2018 with  $277.9 \text{ mm}$  (Fig. 8). In the other years of interest, the cumulated snowfall total was less than  $190 \text{ mm}$ . There were a number of large snowfall events in 2018 which contributed to the larger total precipitation. For example, between 22 and 26 February 2018,  $56.5 \text{ mm w.e.}$  snowfall fell in the region, which is more than the winter (DJF) total snowfall in 2015/16. The regular fresh snow episodes increased the albedo and reflected shortwave incoming radiation at the start of the summer season. A thick, fresh snowpack also has a low density, with more space for liquid water to penetrate instead of sitting on the surface in SGLs. The switch from SGL area increase (lake development) to decrease (freeze up) and back again during June 2018 (Fig. 2) was due to a number of snowfall events in June, which covered any exposed SGLs. The continuous input of snowfall throughout the year and into summer delayed the onset of SGL development at  $870 \text{ m a.s.l.}$  to mid-July 2018 (Table 2), which was the latest in the 4-year period.

The smallest accumulated snowfall from 2016 to 2019 occurred in 2019, with only  $125 \text{ mm}$  falling by May 2019 (Fig. 7). The particularly shallow snowpack provides less water storage availability and lower albedo values, which likely led to the earlier SGL detection in 2019 compared to the other warmer-than-average year of 2016. The later refreeze of SGLs in the previous summer may also have contributed to the earlier detection in 2019. At the end of August 2019,  $21 \text{ mm}$  of snowfall occurred, which started the new accumulation season earlier than in previous years (Fig. 8). Visual



**Table 2.** The timing of the first (last) daily average  $T_a$  greater than 0 °C ( $T_a > 0$  °C), number of days with daily  $T_a$  greater than 0 °C and earliest development (freeze-up) of melt ponds at elevations closest to the AWS elevations; 370 m.a.s.l. relates to KPC\_L elevation and 870 m.a.s.l. relates to KPC\_U elevation.

Year	AWS	$T_a > 0$ °C	No. of days $T_a > 0$ °C (consecutive)	SGLs develop at 370/870 m elevation	$T_a$ consistently < 0 °C	SGLs freeze over at 370/870 m elevation
2016	KPC_L	7 June	84 (70 <sup>a</sup> )	21 June	30 August	18 September <sup>b</sup>
	KPC_U	11 June	79 (44)	27 June	29 August	15 September
2017	KPC_L	1 June	85 (39)	15 June	25 August	12 September
	KPC_U	10 June	73 (16)	15 June	22 August	1 September
2018	KPC_L	20 June	66 (38)	1 July	25 August	20 September <sup>b</sup>
	KPC_U	26 June	51 (8)	12 July	16 August	19 September
2019	KPC_L	6 June	115 (61)	13 June	29 September	13 September
	KPC_U	12 June	67 (14)	13 June	18 August	11 September

<sup>a</sup> One day observed just below 0 °C in this period. <sup>b</sup> End of sensing period. Melt pond development and freeze-over dates are represented in Fig. 5.

analysis of Sentinel-2 data reveals that between 30 August and 16 September 2019 there were very few melt ponds detected due to thick cloud cover. On 20 September 2019, there is evidence of fresh snowfall and very few pond outlines remaining, which agrees with the ERA5 analysis of snowfall towards the end of August and start of September.

To summarise the climatic conditions: we find that a combination of above-average air temperatures, a thin pre-summer snowpack, and summer precipitation falling as rain during summer 2016 and 2019 led to the exposure of a large number of SGLs over a much larger area than observed in the two other years. Conversely, a large amount of snowfall preceding the melt season and below-average air temperatures in 2018 led to the development of very few SGLs, which were restricted to the lower-elevation areas.

### 3.4 Surface mass balance

To assess whether high areas of SGL development relate to the surface mass balance (SMB), the COSIPY SMB estimates from Blau et al. (2021) are used. COSIPY has been previously tested for a number of glaciers in Tibet (Sauter et al., 2020) and evaluated for 79° N Glacier by Blau et al. (2021). The SMB estimates from September to the following August for 2015 to 2018 are shown in Fig. 9 (2018 to 2019 was not simulated, as COSIPY uses the PWRP output as atmospheric input). Spatially, the SMB is similar in 2015/16 to 2016/17 despite the warmer summer of 2016. Low-lying areas of the 79° N Glacier tongue, Zachariae Glacier and areas up to 1000 m.a.s.l. were in a negative SMB area in 2015/16. The following year, the negative SMB extends further inland and to higher altitudes up to 1300 m.a.s.l. (Fig. 9). The similarity in SMB between 2015/16 and 2016/17 is further presented in Fig. 10. Vertically, the annual SMB profiles are similar in 2015/16 and 2016/17 with a negative SMB up to 1400 m.a.s.l. (Fig. 10a).

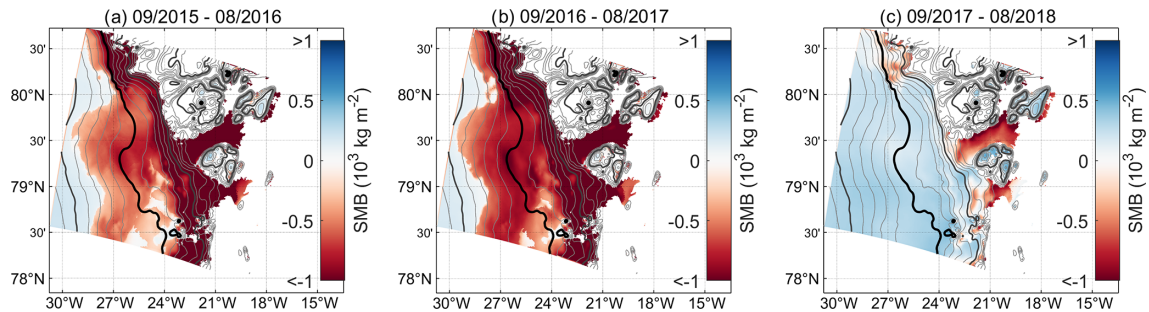
The summer SMB remains negative up to elevations of 1600 m.a.s.l. for both 2016 and 2017, which coincides with the approximate maximum elevations of SGLs in these years (Fig. 4a and b). The annual and summer SMB in 2018 is considerably different to the previous 2 years. The annual SMB is negative only at elevations less than 400 m (Fig. 10), which is restricted to areas of the floating tongue only (Fig. 9). The summer SMB is also only negative up to 1000 m.a.s.l., which also pinpoints the maximum elevation of SGLs in 2018 (Fig. 4c).

It is likely that expansion of melt ponds at higher elevations is partly controlled by spikes in the SMB immediately prior to pond development, especially towards the end of the melt season. In summer 2017, SGL development at higher elevations occurred later in the melt season (Fig. 3), despite the daily  $T_a$  already falling below 0 °C. The week prior to 20 July 2017 (Fig. 3a), SMB was mostly positive at elevations greater than 900 m (Fig. S4a in the Supplement); however, for the five days prior to 23 August 2017 (Fig. 3b), SMB returned to negative at these higher altitudes (Fig. S4b), despite an overall trend towards a positive SMB at lower elevations (Fig. S4c). Therefore, not only the local meteorology, but also the SMB control the SGL development, especially at higher elevations.

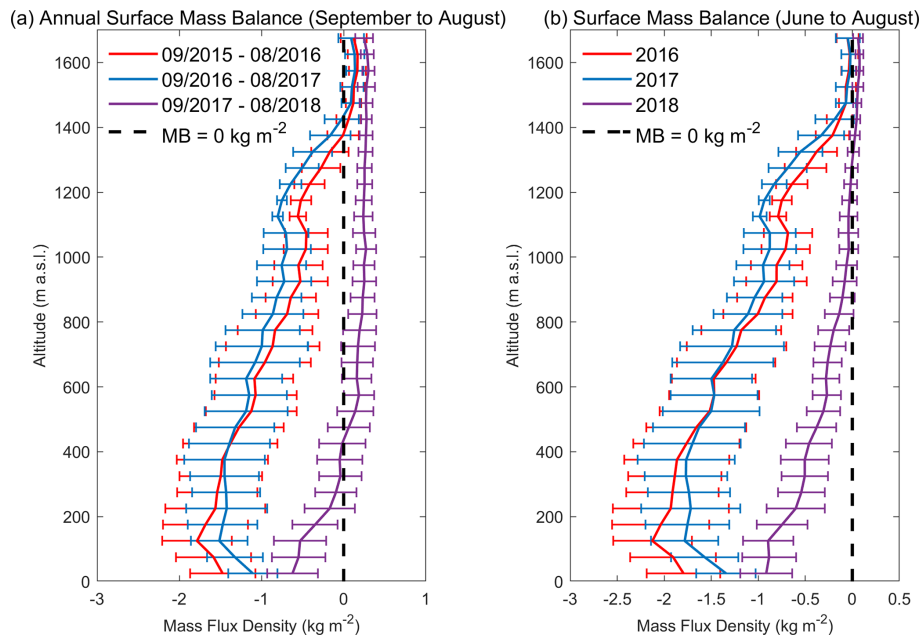
## 4 Discussion

Summer 2016 saw the largest loss of glacier area over the GIS since 2012, which was the standout, record-breaking melt year since records began (Hanna et al., 2014a). Summer 2016 also experienced the largest average individual SGL size (0.07 km<sup>2</sup>), second largest total SGL area and second fastest rate of SGL area growth in our 4-year record. A combination of above-average air temperatures, particularly in mid-June and July, and a large amount of liquid precipitation





**Figure 9.** The annual surface mass balance of the 79° N Glacier and NEGIS region from September to the following August in 2015–2016 (a), 2016–2017 (b), and 2017–2018 (c). There are no estimates for 2018–2019 as the PWRP simulation which is used as input to the COSIPY SMB model was only available until December 2018. The dark black contour marks 1000 m a.s.l. and the grey contours are every 100 m.



**Figure 10.** The annual (a) and summer (JJA) surface mass balance between September 2015 and August 2018, averaged over each altitude in 50 m bands. Error bars indicate the standard deviation of SMB for each grid in the respective altitude band.

during summer was likely responsible for the rapid SGL development and peak in total SGL area in late July. Despite the early observation of  $T_a$  above freezing in 2017, the earliest in our 4-year period, the June 2017 average  $T_a$  was slightly below average. This, combined with the slightly above-average July 2017 temperatures, likely led to the slower rate of increase in SGL area in 2017 compared to 2016 (Fig. 2) and peak in maximum area in early August 2017. The thinner snowpack and limited amount of liquid precipitation falling during summer contributed to the lower maximum SGL area of 153.26 km<sup>2</sup> in 2017 compared to 265.39 km<sup>2</sup> in 2016. In 2018, the spatial distribution of SGLs was different to the other 3 years, with the largest SGL area at elevations between 300 m and 400 m a.s.l. (Fig. 4). Very few SGLs were observed at elevations greater than 900 m, leading to smaller average individual SGL area, as no larger lakes at higher

elevations were identified (Fig. 3). Average individual lake size in 2018 was 0.02 km<sup>2</sup> compared to 0.07 km<sup>2</sup> in 2016 and 0.06 km<sup>2</sup> in 2017 and 2019. A combination of the cooler air temperatures at the start of summer (see Sect. 3.3.1) and thick snowpack led to the delayed onset of SGL development, lower maximum altitude of SGLs and lower total SGL area in 2018 (Fig. 3). Total SGL area was largest in 2019, even though the average size of individual SGLs was the same as in 2017 (0.06 km<sup>2</sup>). A combination of higher air temperatures, more days above freezing and a smaller snowpack at the start of the melt season all contributed to a significantly higher total SGL area in 2019 (Fig. 4). The peak melt pond area at the start of August 2019 coincides with an air temperature peak of 6.9 °C on 2 August at KPC\_L, the warmest daily  $T_a$  ever recorded here (Fig. 5).

Several years within the last decade have been characterised by high air temperature and extreme melting, including two years within our study period (2016 and 2019). With a projected increase in air temperatures and inland expansion of SGLs into the year 2100 (Leeson et al., 2015; Igneczi et al., 2016), it is important to understand the linkages between different climatic variables and the spatial distribution and temporal evolution of SGLs in the north-east of Greenland. Furthermore, the role of supraglacial melting within the glacial–hydrologic system is in need of further assessment. In a number of studies, enhanced surface melting has contributed to accelerated glacier velocity (Bartholomew et al., 2011; Rathmann et al., 2017); however, in other Greenlandic glaciers, especially land-terminating glaciers, ice velocity has decreased with warmer summers (Sundal et al., 2011; Tedstone et al., 2015).

The spatial spread of the SGLs on 79° N Glacier from lower to higher elevations as the melt season progresses is also seen on Leverett Glacier in south-western Greenland (Bartholomew et al., 2011). In south-western Greenland, as the melt season develops, runoff from up-glacier (higher-elevation) regions contributes to subglacial discharge at the base of the land-terminating glacier due to a larger melt area and higher air temperatures (Bartholomew et al., 2011). A similar transport of meltwater from surface to base is hypothesised for 79° N Glacier also. Rathmann et al. (2017) observed a seasonal increase in ice velocity following the particularly warm summer of 2016. An extension of the Rathmann et al. (2017) study and estimation of the volume of water potentially interacting with the base of the glacier are important areas of future research.

The rapid increase in SGL area over 79° N Glacier during June in most years was also observed at Petermann Glacier at 81° N in the north-west of Greenland. Other similarities in SGL characteristics are found between the 79° N and Petermann glaciers, including the spatial distribution of the SGLs and the onset of above-freezing air temperatures at the start of June (Macdonald et al., 2018). The only summer with overlap between the current study and the Macdonald et al. (2018) study is 2016. In both locations, this year was characterised by larger total SGL area and warmer-than-average air temperatures, highlighting the relationship between SGL development and climatic factors across the north of Greenland. However, as noted by Macdonald et al. (2018) and observed in the current study in 2018, the low elevation of these regions dictates that, even in cool years, SGLs still form on the lower sections of the glaciers.

Langley et al. (2016) hypothesised that SGL expansion in the early part of the season is particularly rapid, as even small changes in air temperature can increase the total lake area. A rapid increase in lake area was seen at the start of the 2016 and 2019 melt seasons over 79° N Glacier; however, in 2017, late-summer temperatures led to later expansion of SGLs. The large rate of increase at the start of summer 2016 (Fig. 2) is likely skewed by the slightly lower temporal resolution in

2016 (approximately 3–7 d) compared to the other years (1–2 d). In 2016 and 2017, there was a lower temporal coverage than the following years as only one Sentinel satellite was in orbit and data quality was poorer (Hochreuther et al., 2021). However, upon visual inspection of the satellite images, 2016 also saw a rapid expansion in SGLs similar to 2019.

Warmer summer air temperatures alone do not always lead to enhanced melting. For Shackleton Ice Shelf in Antarctica, the years with largest SGL area and volume were not always in the same years as the highest summer near-surface air temperatures (Arthur et al., 2020). With only 4 years of data in the present study, no major conclusions can be drawn on this; however, it is clear that precipitation also had an impact on SGL area and development over north-eastern Greenland. In Buzzard (2018b), the relationship between snowfall and melt pond depth was not simple or linear. A small amount of snowfall will promote melt pond development, as there is more water available at the surface; however, a high amount of accumulation can bury the melt pond (especially if the surface has started to freeze towards the end of summer) and reduce melting (Buzzard et al., 2018b). We also see evidence of this non-linear response. A combination of a large amount of snowfall prior to the 2018 melt season and below-average summer air temperatures led to a lower total area of SGLs and positive mass balance over the majority of the glacierised area (Figs. 9 and 10). With a thicker snowpack, it took longer for the SGLs to form, as there was more pore space for water to percolate through before pooling. A thick snowpack was also responsible for a 20 d delay between above-zero air temperatures and runoff in the south-west of Greenland, as the meltwater initially refroze within the cold snowpack (Bartholomew et al., 2011). In the present study, the duration between above-zero air temperatures and melt pond development varies from 7 to 14 d at KPC\_L and from 1 to 16 d at KPC\_U. The shortest duration was observed in 2019, which had the thinnest snowpack of the 4-year period. Similar conclusions were found for Tibetan glaciers (Mölg et al., 2012) and Shackleton Ice Shelf in the Antarctic (Arthur et al., 2020).

Conversely, the year with the smallest snowfall amount (2018–2019 accumulation season) was not followed by the summer with the fewest melt ponds. However, the much higher air temperatures and late summer freeze-up of SGLs in 2018 played a bigger role. Summer 2016 saw the second-largest total SGL area and spatial distribution of SGLs. This year also saw a large amount of precipitation fall as rainfall in summer. Rainfall is additional liquid for the surface of the glacier, provides heat to the snowpack, and refreezes into solid ice lenses, which preconditions the glacier surface for further SGL development (Machguth et al., 2016). Rainfall associated with summer storms has been linked to extreme melting events in southern Greenland by Oltmanns et al. (2019) and enhanced ice velocity in western Greenland by Doyle et al. (2015). Similarly, Tedesco and Fettweis (2020) concluded that low snow accumulation was also

partly responsible for the extensive melting along much of the coast of Greenland in 2019.

Relationships between large-scale temporal and spatial anomalies within the atmosphere, termed teleconnections, have been found to influence the climate and mass balance of Greenland (Tedesco et al., 2013; Lim et al., 2016). With only 4 years of data in the current study, we are unable to draw conclusions about the role of teleconnections in the development of SGLs; however, there is evidence that combinations of teleconnection indices play a role in the near-surface climate and therefore SGL development in the north-east of Greenland. In 2016 and 2019, the average summer (JJA) North Atlantic Oscillation (NAO) index was strongly negative ( $-1.36$  for 2016,  $-1.23$  for 2019) (see Supplement for teleconnection data). Simultaneously, both the summer East Atlantic (EA) index and the Greenland Blocking Index (GBI) were strongly positive in both of these years. In summer 2016, the EA (GBI) summer average was  $1.44$  ( $1.73$ ). Similarly, in 2019 the JJA average EA index (GBI) was  $1.1$  ( $2.26$ ). This combination of strong negative NAO and strong positive EA also occurred in both summer 2010 and 2012, when extensive melting was observed over the GIS (Lim et al., 2016). In terms of teleconnections, the biggest differences between the 2016/19 and the 2017/18 summers were the NAO and GBI summer indices. In 2017 the NAO index was positive in June and July. In 2018 the summer NAO index was strongly positive ( $1.74$ ), with all summer months observing a positive NAO signal. The GBI for summers 2017 and 2018 was weakly negative ( $-0.03$ ) and negative ( $-0.57$ ) respectively. In terms of the teleconnection indices evaluated here, summer 2017 appears to be the intermediate or transition year between a particularly strong negative NAO in 2016 and a strong positive NAO in 2018. A decreasing trend in summer NAO since 1981 has been previously identified and is believed to be partly responsible for record-breaking warm temperatures over Greenland in the most recent decade (Hanna et al., 2014b).

The relationship between teleconnections and precipitation is more complicated and is often only significant in the southern part of Greenland, where the majority of the precipitation falls. Bjork et al. (2018) identified a positive relationship between NAO and precipitation in eastern Greenland: there is more precipitation during positive NAO years. The year with the largest cumulative precipitation amounts was the 2017–2018 accumulation season, which was also characterised by a strong positive NAO index. However, the relationship between NAO and precipitation for north-eastern Greenland cannot be assessed with certainty in this study.

Although we present only 4 years of results here and previous studies in this region are sparse, we are confident that SGLs are a persistent feature in the NEGIS and 79° N region. Sundal et al. (2009) observed SGLs between 2003 and 2007 using MODIS data. With the availability of Sentinel data (10 m resolution), the SGL areas are less erroneous than previously stated using lower-resolution MODIS data (250 m)

(Hochreuther et al., 2021). There is an increase in the maximum altitude of SGL detection between the early 2000s study of Sundal et al. (2009) (1200 m a.s.l.) and the results presented here (1600 m a.s.l.). The lakes at these higher elevations are larger and therefore would have been detected by the MODIS data in the Sundal et al. (2009) study had they been present. Therefore, it is likely that maximum lake altitude has increased over time.

This is not surprising given an increasing air temperature trend of  $0.8^{\circ}\text{C decade}^{-1}$  over 79° N Glacier (Turton et al., 2019a) and model suggestions of inland expansion in this area into the 21st century (Ignéczi et al., 2016). Leeson et al. (2015) concluded that maximum lake altitude could reach up to 2221 m a.s.l. with RCP8.5 future projections. Although there are a number of assumptions made in our comparison to Sundal et al. (2009), it is possible that inland expansion of lakes is occurring under increased air temperatures in this region.

Under certain high-melt years, surface rivers have been observed for a number of northern Greenland glaciers, including 79° N (Bell et al., 2017). While we do not consider meltwater channels in our analysis and focus only on SGLs, a number of linear features similar to rivers are clearly visible in the Sentinel data (Fig. S1). This highlights that more liquid water is likely present on and within the glacier than discussed here. There is even some evidence of the persistence of liquid water in melt lakes during the winter season on 79° N Glacier (Schröder et al., 2020). It is hypothesised that lakes beneath the surface were formed in particularly warm years (such as 2019) and then subsequently covered by a thin ice lens or snow (Schröder et al., 2020).

Estimates of the SGL volume are not provided in this study, which is unusual for these types of studies (e.g. Pope et al., 2016; Arthur et al., 2020). We hypothesise that SGLs in this region are much deeper than those observed in the west of Greenland (of the order of 0–10 m). Neckel et al. (2020) recorded the depth of an SGL on 79° N Glacier, which, at the edge of the lake, had a depth of 10.8 m. The same lake drained suddenly in September 2017, and analysis of the height difference from a full to empty lake using DEMs revealed a subsidence of 50 m in the centre of the lake (Neckel et al., 2020). Therefore, applying the same albedo-depth calculation to the lakes in north-eastern Greenland as in western Greenland would largely underestimate the volumes. In situ observations of these lakes are required to calculate depth and volume with a different albedo-depth coefficient. Fieldwork is planned for this region to observe the depths of SGLs.

## 5 Conclusions

In this study we provide a multi-year analysis of the area of SGLs over 79° N Glacier (north-eastern Greenland) and investigate the atmospheric and topographic controls of the

evolution of the lakes. SGLs have been automatically detected using Sentinel-2 data from 2016 to 2019. The melt detection algorithm implemented here and developed by Hochreuther et al. (2021) is automated, meaning that this work can be continued in the future to analyse a long-term time series of SGL evolution. Our findings would ideally now be expanded to include volume estimates and to model the surface and subglacial hydrology to provide an estimate of the volume of freshwater entering the ocean.

Whilst the SGL location is primarily determined by topographic depressions and the slope of the ice sheet, the occurrence of lakes within these depressions relies on the local meteorology and SMB. Similarly to the spatial distribution, the maximum size of individual lakes is controlled by topography. At higher elevations, larger lakes form due to a lower slope angle (Fig. 4). The larger total SGL areas in 2016 and 2019 were due to lakes developing at higher elevations than in 2017 and 2018, as opposed to individual lakes becoming larger. SGLs refreeze and melt in the same locations above the grounding line each year, but maximum inland expansion of the lakes depends on climatic conditions.

The two key climatic variables controlling the development of the SGLs are air temperature and snowfall. Below-average air temperatures and high snowfall accumulation prior to the melt season of 2018 contributed to reduced lake extent, a reduced amplitude in the seasonal cycle of lake evolution, and late-season freeze-up of the SGLs. These climatic conditions led to a largely positive mass balance at all altitudes except the very lowest-lying regions. Conversely, in the prior two years, surface mass balance was negative for a large portion of 79° N Glacier and the surrounding area. Largely this was driven by the above-average air temperature, evident in both the in situ AWS data (Fig. 5) and regional atmospheric modelling output (Figs. 6 and 7). The duration between onset of above-zero air temperatures and SGL development varies between 1 and 16 d, depending on the year and elevation. The snowpack thickness prior to the warm air temperatures likely also has an influence on this duration.

The role of clouds in melt production over the Greenland Ice Sheet is often studied (e.g. Bennartz et al., 2013). Within the 4 years, the warm summer of 2016 coincided with a positive bias in SWin and a reduction in cloud cover; however, the warm June of 2019 was characterised by negative biases in SWin. Similarly, the relatively cool summer of 2018 was characterised by positive anomalies in SWin and higher-than-average cloud cover in June. With just 4 years of data in the current study, no clear conclusions can be drawn about the role of clouds in the development of SGLs in this region.

Whilst 2019 was record breaking in terms of melt over much of the Greenland Ice Sheet, in fact second only to 2012 (Tedesco and Fettweis, 2020), the summer of 2016 was only warm and extreme in the north-eastern region. The extreme summer temperatures led to extensive SGL formation over 79° N Glacier as well as subsequent ice velocity acceleration (Rathmann et al., 2017). Similarly, 2019 was not a record-

breaking melt year in the north-east of Greenland, and at lower elevations, the number of melt days ( $TSK_{melt}$ ) and the duration of melting were less than in other years. This highlights the importance of regional studies of extreme melting as well as Greenland Ice Sheet-wide studies.

There is some evidence of inland expansion of lakes between the Sundal et al. (2009) study, which looked at SGLs between 2003 and 2007, and the present findings from 2016 to 2019. The highest elevation of SGLs in the early 2000s was 1200 m a.s.l., whereas in the late 2010s, SGLs above 1600 m a.s.l. were observed. This is in line with global climate model projections for inland expansion of SGLs and the ablation zone under climate change (Ignéczi et al., 2016). The north-east of Greenland is expected to undergo the largest changes in SMB and SGLs by 2100 and therefore should feature in future atmosphere–glaciohydrology studies.

**Data availability.** The daily average surface mass balance data are available at <https://doi.org/10.5281/zenodo.4434259> (Turton et al., 2021). For higher temporal resolutions, see Blau et al. (2021). The daily average PWRF data are available at <https://doi.org/10.17605/OSF.IO/53E6Z> (Turton, 2019b). For higher temporal resolutions, see Turton et al. (2020). Lake outline polygons and cloud masks are available on request and are currently being uploaded to Pangaea Data Centre, pending a DOI.

**Supplement.** The supplement related to this article is available online at: <https://doi.org/10.5194/tc-15-3877-2021-supplement>.

**Author contributions.** JVT wrote the manuscript and conducted the climatological analysis. PH developed and applied the automatic detection algorithm for the SGLs and assisted in discussing the results. NR assisted in developing the algorithm and writing the manuscript. MTB conducted the SMB modelling and analysis.

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

**Disclaimer.** Publisher's note: Copernicus Publications remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

**Acknowledgements.** We are grateful to the European Space Agency (ESA) for providing the Sentinel-2 data and to the Greenland and Denmark Geological Survey (GEUS) for maintaining the AWS and providing the data. We thank the German Federal Ministry for Education and Research (BMBF) for funding this work as part of the GROCE project (Greenland Ice Sheet/Ocean Interaction). We also thank the High-Performance Computing Centre (HPC) at the University of Erlangen-Nürnberg's Regional Computation Centre

(RRZE) for their support and resources. We also thank two anonymous reviewers and the editor Stef Lhermitte for their insights and feedback.

**Financial support.** This research has been supported by the Bundesministerium für Bildung und Forschung (grant no. 03F0778F and 03F0855F).

**Review statement.** This paper was edited by Stef Lhermitte and reviewed by two anonymous referees.

## References

- Arthur, J. F., Stokes, C. R., Jamieson, S. S. R., Carr, J. R., and Leeson, A. A.: Distribution and seasonal evolution of supraglacial lakes on Shackleton Ice Shelf, East Antarctica, *The Cryosphere*, 14, 4103–4120, <https://doi.org/10.5194/tc-14-4103-2020>, 2020.
- Bartholomew, I., Nienow, P., Sole, A., Mair, D., Cowton, T., Palmer, S., and Wadham, J.: Supraglacial forcing of subglacial drainage in the ablation zone of the Greenland ice sheet, *Geophys. Res. Lett.*, 38, L08502, <https://doi.org/10.1029/2011GL047063>, 2011.
- Blau, M. T., Turton, J. V., Mölg, T., and Sauter, T.: Surface mass and energy balance estimates of the 79N Glacier (Nioghalvfjærdsfjorden, NE Greenland) modeled by linking COSIPY and Polar WRF, *J. Glaciol.*, 1–15, <https://doi.org/10.1017/jog.2021.56>, 2021.
- Bell, R. E., Chu, W., Kingslake, J., Das, I., Tedesco, M., Tinto, K. J., Zappa, C. J., Frezzotti, M., Boghosian, A., and Sang Lee, W.: Antarctic ice shelf potentially stabilized by export of meltwater in surface river, *Nature*, 544, 344–348, <https://doi.org/10.1038/nature22048>, 2017.
- Bennartz, R., Shupe, M., Turner, D., Walden, V. P., Steffen, K., Cox, C. J., Kulie, M. S., Miller, N. B., and Pettersen, C.: July 2012 Greenland melt extent enhanced by low-level liquid clouds, *Nature*, 496, 83–86, <https://doi.org/10.1038/nature12002>, 2013.
- Björk, A. A., Aagaard, S., Lüth, A., Khan, S. A., Box, J. E., Kjeldsen, K. K., Larsen, N. K., Korsgaard, N. J., Cappelen, J., Colgan, W. T., Machguth, H., Andresen, C. S., Peings, Y., and Kjær, K. H.: Changes in Greenland's peripheral glaciers linked to the North Atlantic Oscillation, *Nat. Clim. Change*, 8, 48–52, <https://doi.org/10.1038/s41558-017-0029-1>, 2018.
- Bonne, J.-L., Steen-Larsen, H. C., Risi, C., Werner, M., Sode-mann, H., Lacour, J.-L., Fettweis, X., Cesana, G., Delmotte, M., Cattani, O., Vallelonga, P., Kjær, H. A., Clerbaux, C., Sveinbjörnsdóttir, A. E., and Masson-Delmotte, V.: The summer 2012 Greenland heat wave: in situ and remote sensing observations of water vapor isotopic composition during an atmospheric river event, *J. Geophys. Res.-Atmos.*, 120, 2970–2989, <https://doi.org/10.1002/2014JD022602>, 2015.
- Buzzard, S. C., Feltham, D. L., and Flocco, D.: A mathematical model of melt lake development on an ice shelf, *J. Adv. Model. Earth Sy.*, 10, 262–283, <https://doi.org/10.1002/2017MS001155>, 2018a.
- Buzzard, S., Feltham, D., and Flocco, D.: Modelling the fate of surface melt on the Larsen C Ice Shelf, *The Cryosphere*, 12, 3565–3575, <https://doi.org/10.5194/tc-12-3565-2018>, 2018b.
- Das, S. B., Joughin, I., Behn, M. D., Howat, I. M., King, M. A., Lizarralde, D., and Bhatia, M. P.: Fracture propagation to the base of the Greenland Ice Sheet during supraglacial lake drainage, *Science*, 320, 778–781, <https://doi.org/10.1126/science.1153360>, 2008.
- Doyle, S. H., Hubbard, A., van de Wal, R. S. W., Box, J. E., van As, D., Scharrer, D., Meierbachtol, T. W., Smeets, P. C. J. P., Harper, J. T., Johannson, E., Mottram, R. H., Mikkelsen, A. B., Wilhelms, F., Patton, H., Christoffersen, P., and Hubbard, B.: Amplified melt and flow of the Greenland ice sheet driven by late-summer cyclonic rainfall, *Nat Geosci.*, 8, 647–653, <https://doi.org/10.1038/ngeo2482>, 2015.
- Flowers, G.: Hydrology and the future of the Greenland Ice Sheet, *Nat. Commun.*, 9, 2729, <https://doi.org/10.1038/s41467-018-05002-0>, 2018.
- Hanna, E., Fettweis, X., Mernild, S. H., Cappelen, J., Riber-gaard, M. H., Shuman, C. A., Steffen, K., Wood, L., and Mote, R. L.: Atmospheric and oceanic climate forcing of the exceptional Greenland ice sheet surface melt in summer 2012, *Int. J. Climatol.*, 34, 1022–1037, <https://doi.org/10.1002/joc.3743>, 2014a.
- Hanna, E., Cropper, T. E., Jones, P. D., Scaife, A. A., and Allan, R.: Recent seasonal asymmetric changes in the NAO (a marked summer decline and increased winter variability) and associated changes in the AO and Greenland Blocking Index, *Int. J. Climatol.*, 35, 2540–2554, <https://doi.org/10.1002/joc.4157>, 2014b.
- Hildebrandsson, H. H.: Quelques recherches sur les centres d'action de l'atmosphère, I–IV, *Kungliga Svenska Vetenskaps-Akademiens Handlingar*, 29, 36, 1897.
- Hines, K. M., Bromwich, D. H., Bai, L., Bitz, C. M., Powers, J. G., and Manning, K. W.: Sea Ice Enhancements to Polar WRF, *Mon. Weather Rev.*, 143, 2363–2385, <https://doi.org/10.1175/MWR-D-14-00344.1>, 2015.
- Hochreuther, P., Neckel, N., Reimann, N., Humbert, A., and Braun, M.: Fully automated detection of supra-glacial lake area for northeast Greenland using Sentinel-2 time series, *Remote Sens.-Basel*, 13, 205, <https://doi.org/10.3390/rs13020205>, 2021.
- Howat, I. M., Negrete, A., and Smith, B. E.: The Greenland Ice Mapping Project (GIMP) land classification and surface elevation data sets, *The Cryosphere*, 8, 1509–1518, <https://doi.org/10.5194/tc-8-1509-2014>, 2014.
- Igneczi, A., Sole, A. J., Livingstone, S. J., Leeson, A. A., Fettweis, X., Selmes, N., Gourmelen, N., and Briggs, K.: Northeast sector of the Greenland ice sheet to undergo the greatest expansion of supraglacial lakes during the 21st century, *Geophys. Res. Lett.*, 43, 9729–9738, <https://doi.org/10.1002/2016GL070338>, 2016.
- Khan, S. A., Kjær, K. H., Bevis, M., Bamber, J. L., Wahr, J., Kjeldsen, K. K., Björk, A. A., Korsgaard, N. J., Stearns, L. A., van den Broeke, M. R., Liu, L., Larsen, N. K., and Muresan, I. S.: Sustained mass loss of the northeast Greenland ice sheet triggered by regional warming, *Nat. Clim. Change*, 4, 292–299, <https://doi.org/10.1038/nclimate2161>, 2014.
- Krieger, L., Floricioiu, D., and Neckel, N.: Drainage basin delineation for outlet glaciers of northeast Greenland based on Sentinel-1 ice velocities and TanDEM-



- X elevations, *Remote Sens. Environ.*, 237, 111483, <https://doi.org/10.1016/j.rse.2019.111483>, 2020.
- Kuipers Munneke, P., Smeets, C. J. P. P., Reijmer, C. H., Oerlemans, J., van de Wal, R. S. W., and van den Broeke, M. R.: The K-transect on the western Greenland ice sheet: surface energy balance (2003–2016), *Arct. Antarct. Alp. Res.*, 50, e1420952, <https://doi.org/10.1080/15230430.2017.1420952>, 2018.
- Lampkin, D. J. and VanderBerg, J.: A preliminary investigation of the influence of basal and surface topography on supraglacial lake distribution near Jakobshavn Isbrae, western Greenland, *Hydro. Process.*, 25, 3347–3355, <https://doi.org/10.1002/hyp.8170>, 2011.
- Langley, E. S., Leeson, A. A., Stokes, C. R., and Jamieson, S. S. R.: Seasonal evolution of supraglacial lakes on an East Antarctic outlet glacier, *Geophys. Res. Lett.*, 43, 8563–8571, <https://doi.org/10.1002/2016GL069511>, 2016.
- Leeson, A. A., Shepherd, A., Briggs, K., Howat, I., Fettweis, X., Morlighem, M., and Rignot, E.: Supraglacial lakes on the Greenland ice sheet advance inland under warming climate, *Nat. Clim. Change*, 5, 51–55, <https://doi.org/10.1038/nclimate2463>, 2015.
- Leeson, A. A., Forster, E., Rice, A., Gourmelen, N., and van Wessem, J. M.: Evolution of supraglacial lakes on the Larsen B ice shelf in the decades before it collapsed, *Geophys. Res. Lett.*, 47, e2019GL085591, <https://doi.org/10.1029/2019GL085591>, 2020.
- Lim, Y.-K., Schubert, S. D., Nowicki, S. M. J., Lee, J. N., Molod, A. M., Cullather, R. I., Zhao, B., and Velicogna, I.: Atmospheric summer teleconnections and Greenland Ice Sheet surface mass variations: insights from MERRA-2, *Environ. Res. Lett.*, 11, 024002, <https://doi.org/10.1088/1748-9326/11/2/024002>, 2016.
- Luckman, A., Elvidge, A., Jansen, D., Kulesa, B., Kuipers Munneke, P., King, J., and Barrand, N. E.: Surface melt and ponding on Larsen C ice shelf and the impact of foehn winds, *Antarct. Sci.*, 26, 625–635, <https://doi.org/10.1017/S0954102014000339>, 2014.
- Lüthje, M., Pedersen, L. T., Reeh, N., and Greuell, W.: Modelling the evolution of supraglacial lakes on the West Greenland ice-sheet margin, *J. Glaciol.*, 52, 608–618, <https://doi.org/10.3189/172756506781828386>, 2006.
- Macdonald, G. J., Banwell, A., and MacAyeal, D. R.: Seasonal evolution of supraglacial lakes on a floating ice tongue, Petermann Glacier, Greenland, *Ann. Glaciol.*, 59, 56–65, <https://doi.org/10.1017/aog.2018.9>, 2018.
- MacFerrin, M., Machguth, H., van As, D., Charalampidis, C., Stevens, M., Heilig, A., Vandecrux, B., Langen, P. L., Mottram, R., Fettweis, X., van den Broeke, M. R., Pfeffer, W. T., Moussavi, M. S., and Abdalati, W.: Rapid expansion of Greenland's low permeability ice slabs, *Nature*, 573, 403–407, <https://doi.org/10.1038/s41586-019-1550-3>, 2019.
- Machguth, H., MacFerrin, M., van As, D., Box, J. E., Charalampous, C., Colgan, W., Fausto, R. S., Meijer, H., Mosley-Thompson, E., and van de Wal, R. S. W.: Greenland meltwater storage in firn limited by near-surface ice formation, *Nat. Clim. Change*, 6, 390–393, <https://doi.org/10.1038/nclimate2899>, 2016.
- Malinka, A., Zege, E., Istomina, L., Heygster, G., Spreen, G., Perovich, D., and Polashenski, C.: Reflective properties of melt ponds on sea ice, *The Cryosphere*, 12, 1921–1937, <https://doi.org/10.5194/tc-12-1921-2018>, 2018.
- Mattingly, K. S., Mote, T. L., and Fettweis, X.: Atmospheric river impacts on Greenland ice sheet surface mass balance, *J. Geophys. Res.-Atmos.*, 123, 8538–8560, <https://doi.org/10.1029/2018JD028714>, 2018.
- Mattingly, K. S., Mote, T. L., Fettweis, X., van As, D., Van Tricht, K., Lhermitte, S., Pettersen, C., and Fausto, R. S.: Strong summer atmospheric rivers trigger Greenland ice sheet melt through spatially varying surface energy balance and cloud regimes, *J. Climate*, 33, 6809–6832, <https://doi.org/10.1175/JCLI-D-19-0835.1>, 2020.
- Mayer, C., Schaffer, J., Hattermann, T., Floricioiu, D., Krieger, L., Dodd, P. A., Kanzow, T., Licciulli, C., and Schannwell, C.: Large ice loss variability at Nioghalvfjærdsfjorden Glacier, Northeast Greenland, *Nat. Commun.*, 9, 2768, <https://doi.org/10.1038/s41467-018-05180-x>, 2018.
- Mölg, T., Maussion, F., Yang, W., and Scherer, D.: The footprint of Asian monsoon dynamics in the mass and energy balance of a Tibetan glacier, *The Cryosphere*, 6, 1445–1461, <https://doi.org/10.5194/tc-6-1445-2012>, 2012.
- Mouginot, J., Rignot, E., Scheuchl, B., Fenty, I., Khazendar, A., Morlighem, M., Buzzi, A., and Paden, J.: Fast retreat of Zachariae Isstrøm, northeast Greenland, *Science*, 350, 1357–1361, <https://doi.org/10.1126/science.aac7111>, 2015.
- Neckel, N., Zeising, O., Steinhage, D., Helm, V., and Humbert, A.: Seasonal observations at 79° N Glacier (Greenland) from remote sensing and in situ measurements, *Front. Earth Sci.*, 8, 142, <https://doi.org/10.3389/feart.2020.00142>, 2020.
- Noël, B., van de Berg, W. J., Lhermitte, S., and van den Broeke, M.: Rapid ablation zone expansion amplifies north Greenland mass loss, *Science Advances*, 5, eaaw0123, <https://doi.org/10.1126/sciadv.aaw0123>, 2019.
- Oltmanns, M., Straneo, F., and Tedesco, M.: Increased Greenland melt triggered by large-scale, year-round cyclonic moisture intrusions, *The Cryosphere*, 13, 815–825, <https://doi.org/10.5194/tc-13-815-2019>, 2019.
- Perovich, D. K., Grenfell, T. C., Light, B., and Hobbs, P. V.: Seasonal evolution of the albedo of multiyear Arctic sea ice, *J. Geophys. Res.-Oceans*, 107, 20-1–20-13, <https://doi.org/10.1029/2000JC000438>, 2002.
- Pope, A., Scambos, T. A., Moussavi, M., Tedesco, M., Willis, M., Shean, D., and Grigsby, S.: Estimating supraglacial lake depth in West Greenland using Landsat 8 and comparison with other multispectral methods, *The Cryosphere*, 10, 15–27, <https://doi.org/10.5194/tc-10-15-2016>, 2016.
- Rathmann, N. M., Hvidberg, C. S., Solgaard, A. M., Grinsted, A., Gudmundsson, H., Langen, P. L., Nielsen, K. P., and Kusk, A.: Highly temporally resolved response to seasonal surface melt of the Zachariae and 79N outlet glaciers in northeast Greenland, *Geophys. Res. Lett.*, 44, 9805–9814, <https://doi.org/10.1002/2017GL074368>, 2017.
- Sauter, T., Arndt, A., and Schneider, C.: COSIPY v1.3 – an open-source coupled snowpack and ice surface energy and mass balance model, *Geosci. Model Dev.*, 13, 5645–5662, <https://doi.org/10.5194/gmd-13-5645-2020>, 2020.
- Schröder, L., Neckel, N., Zindler, R., and Humbert, A.: Perennial Supraglacial Lakes in Northeast Greenland Ob-

- served by Polarimetric SAR, *Remote Sens.-Basel*, 12, 2798, <https://doi.org/10.3390/rs12172798>, 2020.
- Smith, L., Yang, K., Pitcher, L. H., Overstreet, B. T., Chu, V. W., Rennermalm, A. K., Ryan, J. C., Cooper, M. G., Gleason, C. J., Tedesco, M., Jeyaratnam, J., van As, D., van den Broeke, M. R., van de Berg, W. J., Noël, B., Langen, P. L., Cullather, R. I., Zhao, B., Willis, M. J., Hubbard, A., Box, J. E., Jenner, B. A., and Bhar, A. E.: Direct measurements of meltwater runoff on the Greenland ice sheet surface, *P. Natl. Acad. Sci. USA*, 114, E10622–E10631, <https://doi.org/10.1073/pnas.1707743114>, 2017.
- Stevens, L. A., Behn, M. D., McGuire, J. J., Das, S. B., Joughin, I., Herring, T., Shean, D. E., and King, M. A.: Greenland supraglacial lake drainages triggered by hydrologically induced basal slip, *Nature*, 522, 73–76, <https://doi.org/10.1038/nature14480>, 2015.
- Sundal, A. V., Shepherd, A., Nienow, P., Hanna, E., Palmer, S., and Huybrechts, P.: Evolution of supra-glacial lakes across the Greenland Ice Sheet, *Remote Sens. Environ.*, 113, 2164–2171, <https://doi.org/10.1016/j.rse.2009.05.018>, 2009.
- Sundal, A. V., Shepherd, A., Nienow, P., Hanna, E., Palmer, S., and Huybrechts, P.: Melt-induced speed-up of Greenland ice sheet offset by efficient subglacial drainage, *Nature*, 469, 520–524, <https://doi.org/10.1038/nature09740>, 2011.
- Tedesco, M. and Fettweis, X.: Unprecedented atmospheric conditions (1948–2019) drive the 2019 exceptional melting season over the Greenland ice sheet, *The Cryosphere*, 14, 1209–1223, <https://doi.org/10.5194/tc-14-1209-2020>, 2020.
- Tedesco, M., Lütke, M., Steffen, K., Steiner, N., Fettweis, X., Willis, I., Bayou, N., and Banwell, A.: Measurement and modeling of ablation of the bottom of supraglacial lakes in western Greenland, *Geophys. Res. Lett.*, 39, L02502, <https://doi.org/10.1029/2011GL049882>, 2012.
- Tedesco, M., Fettweis, X., Mote, T., Wahr, J., Alexander, P., Box, J. E., and Wouters, B.: Evidence and analysis of 2012 Greenland records from spaceborne observations, a regional climate model and reanalysis data, *The Cryosphere*, 7, 615–630, <https://doi.org/10.5194/tc-7-615-2013>, 2013.
- Tedstone, A. J., Nienow, P. W., Gourmelen, N., Dehecq, A., Goldberg, D., and Hanna, E.: Decadal slowdown of a land-terminating sector of the Greenland Ice Sheet despite warming, *Nature*, 526, 692–695, <https://doi.org/10.1038/nature15722>, 2015.
- Tedesco, M., Mote, T., Fettweis, X., Hanna, E., Jeyaratnam, J., Booth, J. F., Datta, R., and Briggs, K.: Arctic cut-off high drives the poleward shift of a new Greenland melting record, *Nat. Commun.*, 11723, <https://doi.org/10.1038/ncomms11723>, 2016.
- Tedstone, A. J., Bamber, J. L., Cook, J. M., Williamson, C. J., Fettweis, X., Hodson, A. J., and Tranter, M.: Dark ice dynamics of the south-west Greenland Ice Sheet, *The Cryosphere*, 11, 2491–2506, <https://doi.org/10.5194/tc-11-2491-2017>, 2017.
- Turton, J. V., Mölg, T., and Van As, D.: Atmospheric Processes and Climatological Characteristics of the 79N Glacier (Northeast Greenland), *Mon. Weather Rev.*, 147, 1375–1394, <https://doi.org/10.1175/MWR-D-18-0366.1>, 2019a.
- Turton, J. V., Mölg, T., and Collier, E.: NEGIS\_WRF model output, Open Science Framework Repository [Data set], last access: 1 October 2019, <https://doi.org/10.17605/OSF.IO/53E6Z>, 2019b.
- Turton, J. V., Mölg, T., and Collier, E.: High-resolution (1 km) Polar WRF output for 79° N Glacier and the northeast of Greenland from 2014 to 2018, *Earth Syst. Sci. Data*, 12, 1191–1202, <https://doi.org/10.5194/essd-12-1191-2020>, 2020.
- Turton, J., Blau, M., Sauter, T., and Mölg, T.: COSIPY-WRF Daily SMB output 2014–2018 [Data set], Zenodo, <https://doi.org/10.5281/zenodo.4434259>, 2021.
- Van de Wal, R. S. W., Greuell, W., van den Broeke, M. R., Reijmer, C. H., and Oerlemans, J.: Mass balance measurements along a transect in West-Greenland over the period 1990–2003, *Ann. Glaciol.*, 42, 311–316, <https://doi.org/10.3189/172756405781812529>, 2005.
- van de Wal, R. S. W., Boot, W., Smeets, C. J. P. P., Snellen, H., van den Broeke, M. R., and Oerlemans, J.: Twenty-one years of mass balance observations along the K-transect, West Greenland, *Earth Syst. Sci. Data*, 4, 31–35, <https://doi.org/10.5194/essd-4-31-2012>, 2012.
- van As, D. and Fausto, R.: Programme for Monitoring of the Greenland Ice Sheet (PROMICE): first temperature and ablation records, *Geolog. Survey Denmark Greenland Bulletin*, 23, 73–76, <https://doi.org/10.34194/geusb.v23.4876>, 2011. =
- Vijay, S., Khan, S. A., Kusk, A., Solgaard, A. M., Moon, T., and Bjørk, A. A.: Resolving seasonal ice velocity of 45 Greenlandic glaciers with very high temporal details, *Geophys. Res. Lett.*, 46, 1485–1495, <https://doi.org/10.1029/2018GL081503>, 2019.
- Wang, C., Graham, R. M., Wang, K., Gerland, S., and Granskog, M. A.: Comparison of ERA5 and ERA-Interim near-surface air temperature, snowfall and precipitation over Arctic sea ice: effects on sea ice thermodynamics and evolution, *The Cryosphere*, 13, 1661–1679, <https://doi.org/10.5194/tc-13-1661-2019>, 2019.
- Williamson, A. G., Arnold, N. S., Banwell, A. F., and Willis, I. C.: A Fully Automated Supraglacial lake area and volume Tracking (“FAST”) algorithm: Development and application using MODIS imagery of West Greenland, *Remote Sens. Environ.*, 196, 113–133, <https://doi.org/10.1016/j.rse.2017.04.032>, 2017.
- Williamson, A. G., Banwell, A. F., Willis, I. C., and Arnold, N. S.: Dual-satellite (Sentinel-2 and Landsat 8) remote sensing of supraglacial lakes in Greenland, *The Cryosphere*, 12, 3045003065, <https://doi.org/10.5194/tc-12-3045-2018>, 2018.
- Yang, K., Smith, L. C., Fettweis, X., Gleason, C. J., Lu, Y., and Li, M.: Surface meltwater runoff on the Greenland ice sheet estimated from remotely sensed supraglacial lake infilling rate, *Remote Sens. Environ.*, 234, 111459, <https://doi.org/10.1016/j.rse.2019.111459>, 2019.
- Zwally, H. J., Abdalati, W., Herring, T., Larson, K., Saba, J., and Steffen, K.: Surface melt-induced acceleration of Greenland ice sheet flow, *Science*, 297, 218–222, <https://doi.org/10.1126/science.1072708>, 2002.