Greenland Ice Sheet Surface Melt and Its Relation to Daily Atmospheric Conditions

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ABSTRACT

Melt area is one of the most reliably monitored variables associated with surface conditions over the full Greenland Ice Sheet (GrIS). Surface melt is also an important indicator of surface mass balance and has potential relevance to the ice sheet’s global sea level contribution. Melt events are known to be spatially heterogeneous and have varying time scales. To understand the forcing mechanisms, it is necessary to examine the relation between the existing conditions and melt area on the time scales that melt is observed. Here, the authors conduct a regression analysis of atmospheric reanalysis variables including sea level pressure, near-surface winds, and components of the surface energy budget with surface melt. The regression analysis finds spatial heterogeneity in the associated atmospheric circulation conditions. For basins in the southern GrIS, there is an association between melt area and high pressure located south of the Denmark Strait, which allows for southerly flow over the western half of the GrIS. Instantaneous surface melt over northern basins is also associated with low pressure over the central Arctic. Basins associated with persistent summer melt in the southern and western GrIS are associated with the presence of an enhanced cloud cover, a resulting decreased downwelling solar radiative flux, and an enhanced downwelling longwave radiative flux. This contrasts with basins to the north and east, where an increased downwelling solar radiative flux plays a more important role in the onset of a melt event. The analysis emphasizes the importance of daily variability in synoptic conditions and their preferred association with melt events.

1. Introduction

The Greenland Ice Sheet (GrIS) represents a significant store of freshwater that may be intermittently released into the global ocean. Recent studies using satellite-derived mass change have indicated the GrIS has made a substantial contribution to global sea level in the past decades (Shepherd et al. 2012). Historically, it has been thought that this contribution has been equally divided between iceberg calving and surface processes (e.g., van den Broeke et al. 2009). Observed, enhanced surface melt over the GrIS in the past decade has led to an increased focus on surface mass balance (SMB) and an identification of surface melt as having a dominant role in the contribution of the ice sheet to sea level rise (Rignot et al. 2011; Velicogna et al. 2014; Enderlin et al. 2014; van den Broeke et al. 2016).

Arguably, the most consistent and reliable source of surface melt data encompassing the full GrIS is passive microwave data. NASA’s Making Earth System Data Records for Use in Research Environments (MEaSUREs) program daily surface melt product (Mote and Anderson 1995; Mote 2007) covers the full ice sheet with a grid spacing of 25 km. These data have been used to document the recent, enhanced melt over the last decade, including the 11 July 2012 event in which nearly the entirety of the GrIS experienced melt conditions. It is of interest to understand the conditions and processes that are associated with enhanced melt events that are documented in these data. Previous studies have focused on the presence of intense North Atlantic atmospheric blocking events (e.g., Rajewicz and Marshall 2014; Häkkinen et al. 2014; McLeod and Mote 2016). These...
conditions may preferentially allow for an enhanced solar radiative flux to reach the ice sheet surface and allow for albedo feedback processes to promote large-scale melting. Alternatively, Bennartz et al. (2013) identified the importance of warm air advection and the role of clouds in communicating melt energy to the ice sheet surface via increased downwelling longwave fluxes. Recently, Tedesco et al. (2016a) noted the role of Arctic high pressure systems in producing increased melt over the northern regions of the GrIS during the 2016 season. The large-scale atmospheric circulation may produce increased melt by providing cloudless conditions that enhance solar radiation, by the advection of warm air over the ice sheet (Fettweis et al. 2011), by providing moisture and cloud cover that alters downwelling infrared flux properties, and/or by influencing turbulent fluxes and surface winds. It is widely acknowledged that the GrIS climate experiences considerable spatial variability (e.g., Chen et al. 1997; Vernon et al. 2013; Velicogna et al. 2014). The geographical proximity of an ice sheet location to anomalous circulation may produce localized conditions which enhance or inhibit melt.

It is of interest to understand the conditions present during extreme melt events and identify how the conditions vary regionally across the ice sheet. In this study, the daily MEaSUREs dataset is examined in relation to concurrent conditions using a simple linear regression analysis. The conditions are examined regionally by using defined GrIS basins. Atmospheric general circulation and cloud conditions are described using the Modern-Era Retrospective Analysis for Research and Applications, version 2 (MERRA-2). Section 2 provides a description of the datasets used and the regression method. In section 3, a discussion of general circulation, energy budget components, and temperature fields regressed against observed melt area is provided. Anecdotal case studies are given in section 4, which provide additional insight into the determined patterns. A discussion and summary is given in section 5.

2. Datasets and method

MERRA-2 is a global atmospheric reanalysis produced by the NASA Global Modeling and Assimilation Office for the period from 1980 to the present (Gelaro et al. 2017; Global Modeling and Assimilation Office 2015a,b,c,d). The output fields are produced in hourly averaged fields at 1/8° latitude by 1/5° longitude for surface flux and single level fields. For this study, the hourly fields are averaged to produce daily output. MERRA-2 represents an update of the original MERRA system (Rienecker et al. 2011) and includes improvements made to the data assimilation system and background model (Molod et al. 2015). The prognostic cloud cover simulates large-scale condensation, evaporation, auto-conversion, and accretion of cloud water and ice, sedimentation of cloud ice, and reevaporation of falling precipitation (Molod 2012; Bacmeister et al. 2006). Terrestrial and solar radiative processes are described by Chou and Suarez (1994, 1999). Over polar ice sheets, the surface representation has been updated to provide a prognostic snow albedo (Gruell and Konzelmann 1994), improve the representation of surface energy conductivity, and represent snow hydrology processes including compaction, meltwater percolation, refreezing, and runoff (Cullather et al. 2014).

The MEaSUREs daily melt fields were obtained from the U.S. National Snow and Ice Data Center for the available period 1980–2012 and are provided on the Equal Area Scalable Earth Grid 2.0 (EASE-2; Mote 2014). The data are derived from available SMMR, SSM/I, and SSMIS radiances after Mote and Anderson (1995). The data are available on alternating days for the SMMR instrument period prior to 9 July 1987, and daily thereafter. Surface melt is determined via comparison of 37-GHz, horizontally polarized brightness temperatures with dynamic thresholds generated by a microwave emission model.

For this study, the daily melt area is summed over major GrIS basins defined by Zwally et al. (2012), producing a time series of summed daily melt area normalized by the size of each basin. A subset of the time series is taken in which melt area is greater than 5% of the basin area. This limits the regression analysis to the melt season and the relation of melt to conditions that are concurrently observed, while maintaining a large sample size. An average of 1000 days over the 33-yr period are available for each basin. Concurrent MERRA-2 anomalies were computed by subtracting the calendar day mean for the 1980–2010 period. The least squares linear trend was then removed from the anomaly fields. Linear regression coefficients were then computed using the melt area time series and concurrent MERRA-2 anomaly variables at each grid point. The coefficients are expressed as the units of the MERRA-2 variable per total area of the basin. The uncertainty in the regression is indicated using the Student’s t statistic at the 99% confidence level. Field significance (e.g., Livezey and Chen 1983) for select, representative variables (sea level pressure, skin temperature, and cloud fraction) was evaluated via a Monte Carlo procedure. For the procedure, the regression analysis is recursively computed using a randomized ordering of the melt area time series. The area of statistical significance is then computed for each iteration. Using northern and southern
basin melt areas (basins 1 and 5 indicated in Fig. 1) regressed against MERRA-2 for the region poleward of 50°N, the unrandomized regression area of significance was found to be within the 95% confidence of the Monte Carlo distribution. While field significance has not been assessed for all results shown, it is also important to consider results in the context of the physical processes involved. This serves as an additional motivating factor in examining individual ice sheet melt events in more detail.

Figure 1 shows the major drainage basins as defined by Zwally et al. (2012), which are widely used in literature (e.g., Seo et al. 2015; Colgan et al. 2015). The basins range in size from 51 000 km² for basin 5 in the south to 326 000 km² for basin 2 in the northeast. A typical sample of the time series of daily surface melt is shown in Fig. 1b. Each time series of melt area has been normalized by the total basin area. It may be seen that the time series contains high temporal variability and that events occur on short time scales. On average there is a defined seasonal cycle with larger values in summer. But the time series of an individual year is not necessarily sinusoidal, and significant departures may occur (e.g., Cullather et al. 2016). There are periods where several basins or even the total ice sheet is responding similarly, such as during July 2012. At other times, however, the observed melt area is localized. Over the full 1980–2012 period, Table 1 presents correlations of these time series. The temporal variability of melt area in adjacent basins tends to be better correlated, such as basin 1 and basin 2 in the north and northeast and basins 5 and 6 in the south and southwest. The correlation between northern and southern basins tends to be lower. This may be reflective of the different character of the time series shown by Cullather et al. (2016), in which melt in the southern GrIS tends to be more episodic. Western basins are generally well correlated with melt over the total GrIS. Basin 5 in the south, which experiences the most frequent melt, is less correlated with the total GrIS melt area.

3. Results

Results of the regression analysis are given below for MERRA-2 variables associated with atmospheric circulation, clouds and surface radiative flux variables, and near-surface winds. Anecdotal case studies of historical GrIS melt events using the determined relations are then presented.

a. General circulation

Figure 2 shows spatial patterns of regression of MERRA-2 skin temperature against the summed passive microwave melt area. For each map, the green outline denotes the basin over which melt area values were computed. These area values are then regressed against the MERRA-2 fields. As noted in Hall et al. (2009), skin temperature is closely related to the presence of surface melt, and the regression maps reflect this correspondence. The analysis denotes simultaneous skin temperature...
anomalies at individual locations for surface melt occurring within the basin highlighted in green. Melt occurring throughout the entirety of the GrIS (center map) is associated with significant, positive temperature anomalies over most locations, but particularly large values at interior locations over the western and southern regions of the ice sheet, where melt occurs more frequently. For southern basin 5, locations within its boundary are associated with positive skin temperature anomalies of up to 6°C. Locations within basin 5 that are farther inland are found to be associated with larger anomalies, which conforms to a climatology of decreasing temperatures with elevation and the necessity of a larger temperature anomaly in order to produce melt. Locations at lower elevations that frequently experience melt are associated with smaller temperature anomalies. Thus the basin geometry plays a key role in the realized patterns. Similarly, the magnitude of skin temperature anomalies determined from regression using southern basins is generally smaller than is shown for regression maps of melt area in northern basins. The regression maps shown in Fig. 2 broadly reflect correlations between basins that are indicated in Table 1. Surface melt area for basin 5 is correlated with melt area in adjacent basins 4 and 6. Positive temperature anomalies are shown for these locations in the regression map for basin 5; for the northern areas of the GrIS, the regression values are smaller and there is no statistical significance. Melt occurring in eastern basin 3 is associated with large temperature anomalies occurring over the central part of the GrIS. This implies that melt occurring in basin 3 is associated with conditions affecting a region larger than the size of the basin. Regression patterns for southern basins 4, 5, and 6 are more localized than for northern basins 2 and 8 and for central basins 3 and 7. Temperature anomalies associated with basin 1 are also more localized than adjacent basins.

Figure 3 similarly presents the spatial regression patterns of surface melt area for each basin with MERRA-2 500-hPa geopotential height anomalies. Daily melt area over the total GrIS is associated with significant positive height anomalies over Greenland, centered in the southeastern part of the island, a pattern in agreement with the analysis of Häkkinen et al. (2014) for the 2000–13 Moderate Resolution Imaging Spectroradiometer (MODIS) period. For regression maps of individual basins, the patterns of height anomalies differ depending on the basin geography. Southern basins 4, 5, and 6 are associated with positive height anomalies occurring in a localized area south of the Denmark Strait. This would suggest anticyclonic flow around the height anomaly, producing southerly advection over the southern half of the GrIS. Regression maps for eastern basin 3 over the central latitudes of the ice sheet indicate the center of the height anomaly is displaced northward and to the northwest of Iceland. The regression pattern for basin 7 is similar to that of basin 3 but with the height anomaly located slightly to the south and west. The regression map for northeastern basin 2 shows positive height anomalies over the basin and centered along the southern boundary, but a negative height anomaly over the central Arctic Ocean is also indicated. The only basin regression indicating a height anomaly centered over the western side of the ice sheet is basin 1. This pattern is more consistent with an eastward advection into the basin 1 region. For northern basins, the regression maps generally indicate negative height anomalies over the British Isles and Scandinavia. For each of the basins shown in Fig. 3, locations within the basin itself are associated with positive height anomalies.

Figure 4 shows corresponding patterns for MERRA-2 sea level pressure. In general, there is uncertainty in numerical analyses associated with the reduction of surface observations to sea level in locations of high topography, which must be kept in mind; this corresponds to places over the central GrIS. In Fig. 4 there is a considerable amount of correspondence between the regression patterns in sea level pressure and for 500-hPa geopotential height anomalies shown in Fig. 3. This suggests an equivalent-barotropic structure in the anomaly patterns, which is associated with atmospheric blocking events.
FIG. 2. Regression of passive microwave-derived daily melt area for basins indicated in green to detrended MERRA-2 surface temperature anomalies at each grid point for 1980–2012, in °C. The melt area time series is normalized by the total area of the basin and is restricted to values greater than 5% of the basin area. (center) The regression pattern for daily melt area summed over the entire ice sheet (Total GrIS). Hatched areas denote regression significance at the 99% confidence level.
The pattern is readily seen for southern basin regression maps in which positive pressure anomalies are collocated with positive values in the height field. For basins 1, 3, 7, and 8, the geopotential height anomaly shown in Fig. 3 is located over the ice sheet surface. The sea level pressure regression patterns shown in Fig. 4 are partially obstructed by the ice sheet surface, but for locations beyond the ice sheet periphery there is general agreement between the height and sea level pressure patterns. The regression pattern of sea level pressure anomalies for northeastern basin 2 differs from the corresponding geopotential height field regression in several aspects. The pressure anomalies for locations within the basin are negative as compared to positive values in the height field. This is true even for coastal locations in the basin at low elevation. The sea level pressure regression pattern for basin 2 indicates no positive anomalies within proximity of the ice sheet. The regression field also does not reflect the positive height values over southern Labrador found in the corresponding 500-hPa height anomaly regression shown in Fig. 3.

The importance of the positive pressure values southeast of the GrIS is partly conveyed by the regression patterns associated with temperature anomalies in the free
atmosphere. Corresponding patterns for MERRA-2 700-hPa temperature are shown in Fig. 5. The regression patterns for the total GrIS and for most of the individual basins indicate a positive temperature anomaly centered to the eastern side of the ice sheet. These areas correspond to the location of greatest disruption in the North Atlantic baroclinic flow imposed by the blocking height anomalies. Positive temperature anomalies overlie each basin in the analysis.

Recent studies have suggested a relation between GrIS surface conditions and adjacent sea ice cover (e.g., Rennermalm et al. 2009; Liu et al. 2016; Hanna et al. 2014; Noël et al. 2014). Summertime Arctic ice cover has trended significantly lower in recent years, concurrent with increased GrIS surface melt. While enhanced melt cover in northern and western basins is associated with a reduced sea ice concentration in adjacent areas (not shown), a cause-and-effect relation is not supported through regression analysis alone.

b. Cloudiness and surface radiative fluxes

Figure 6 indicates regression patterns associated with the MERRA-2 surface downwelling longwave radiative
FIG. 5. As in Fig. 2, but for detrended MERRA-2 700-hPa temperature anomalies, in °C. Gray shading indicates missing data (the intersection of the 700-hPa level with orography).
Fig. 6. As in Fig. 2, but for detrended MERRA-2 surface downwelling longwave radiative flux anomalies, in W m$^{-2}$. 
flux. As with surface temperature, the anomalies are positive and significant within each basin considered, and the spatial maxima in the patterns is generally located within the boundaries of the basin. For the entirety of the GrIS, the regression pattern indicates larger anomalies located to the west of the center of the ice sheet. Smaller values between 40 and 60 W m\(^{-2}\) are found in the southwestern GrIS, while values less than 40 W m\(^{-2}\) are found in the northeast. The magnitudes of the longwave anomalies are larger for central basins 3 and 7 and for northwestern basin 8. For these basins, anomalies are locally greater than 60 W m\(^{-2}\), while anomalies are less for southern and northeastern basins.

The surface downwelling shortwave radiative flux regression maps shown in Fig. 7 contrast with the longwave in showing both significant positive and negative anomalies over large areas of the ice sheet. For the full GrIS, the regression indicates positive anomalies over the eastern side, with values of up to 45 W m\(^{-2}\), which increase in magnitude toward the coast. Along the western side of the GrIS, the regression values are negative with magnitudes of up to \((-\) 50 W m\(^{-2}\) along the western periphery. Negative values also encompass the southern edge of the ice sheet. In the regressions for each basin, enhanced melt area is associated with a decreased downwelling solar flux within the basin for southern basins 4, 5, and 6 and western basins 7 and 8. There is an indication of a topographical influence on the western basin regressions, with values becoming smaller at higher elevation. This is particularly true in the vicinity of South Dome. For northern basin 1, the values are generally negative within the boundaries, although the significance is less uniform. The magnitudes shown are generally larger for regressions associated with the western basins, with values greater than \((-\) 50 W m\(^{-2}\), while the magnitude for basin 1 is generally less than 25 W m\(^{-2}\). For northeastern basin 2, the analysis indicates small positive values within the basin domain of less than 40 W m\(^{-2}\), which increase toward the coastline, and negative values in the northwest and southern regions of the ice sheet. But the field is not significant over most of the ice sheet. For eastern basin 3, values are small but mostly positive within the basin boundaries. There is an area of significant negative values along the southern edge of the basin. Beyond the boundaries of basin 3, there are significant positive values over the northeastern GrIS and significant negative values to the southwest.

An enhanced downwelling longwave flux may result from the presence of emitting cloud water or ice but also in the presence of advected warm air. In contrast, the presence of clouds during sunlit hours will invariably alter the downwelling shortwave flux. Thus the regression patterns for cloud fraction are expected to more closely resemble those of the shortwave flux shown in Fig. 7, except for in the presence of optically thin clouds. As shown in Fig. 8, the patterns of MERRA-2 total cloud fraction generally reflect the regression patterns for the downwelling shortwave flux shown in Fig. 7. For the regression over the total GrIS, enhanced melt area is associated with significantly less cloud cover in the northeastern GrIS, and more cloudiness in the western and southern GrIS. Differences in the patterns for Figs. 7 and 8 are associated with conditions that extend beyond the boundaries of basins for the melt area considered. Nevertheless the patterns are broadly similar.

c. Near-surface winds

The examination of regression patterns associated with circulation and radiative variables finds a contrast between general conditions promoting surface melt in the southern GrIS, where warmer temperatures are more common, and northern regions of the ice sheet. But a contrast is also found between western basins, where atmospheric moisture appears to play a significant role, and eastern basins, where localized, episodic conditions may be important. In particular, northeast basin 2 was found to have an association of less cloudy conditions with surface melt. These regions follow a characterization of near-surface winds given by Moore et al. (2013). Moore et al. (2013) identified a southerly near-surface plateau jet along the western side of the ice sheet in summer and a distinct, westerly jet over the northeastern GrIS. A regression analysis of 10-m zonal and meridional components to the melt area is performed and is shown in Fig. 9. The regression patterns indicate the relation of southerly winds over the western two-thirds of the ice sheet to enhanced melt, which is consistent with the advection of atmospheric moisture over the western side of the ice sheet. The zonal wind regression indicates easterly near-surface winds over the southern third of the GrIS and westerly winds focused over the lower elevations of basin 3 on the eastern GrIS. These patterns are consistent with a terrain-following anticyclonic circulation centered to the southeast of the GrIS.

d. Case studies

Given these general characteristics from regression covering the full satellite era, examination of individual melt events provides illustrative information on the applicability of these patterns to given cases. While anecdotal, the cases include widely studied and documented melt events that occurred on the GrIS.

The most significant melt event for the period investigated occurred on 11 July 2012, in which almost 90% of the ice sheet was simultaneously experiencing surface
Fig. 7. As in Fig. 2, but for detrended MERRA-2 surface downwelling shortwave radiative flux anomalies, in W m$^{-2}$. 
Fig. 8. As in Fig. 2, but for detrended MERRA-2 total cloud fraction anomalies.
melt, including Summit. The 2012 event has been extensively studied (e.g., Nghiem et al. 2012; Bennartz et al. 2013; Tedesco et al. 2013; Fausto et al. 2016). The synoptic patterns associated with the event are shown in Fig. 10a and include a blocking surface high pressure centered to the west of Iceland and strong southeasterly flow over the southern part of the ice sheet. Conditions were also characterized by extensive cloud cover over the southern and western areas of the ice sheet. While melt over most of the GrIS was reduced in the ensuing days, a large area of surface melt over northern basin 1 persisted for the following 5 days. This period was associated with a low pressure system over the Arctic Ocean, to the north of the GrIS. The reanalysis also indicates cloud cover over most of the ice sheet during the day of largest melt area, in agreement with observations (Bennartz et al. 2013).

A significant event occurred over the period 14–19 July 1989, in which roughly 35% of the GrIS simultaneously experienced melt on 15 July. As seen in Fig. 11, the melt area is primarily located in the southern half of the GrIS. A broad high pressure system was located near Iceland but was centered to the southeast (Fig. 11). Nevertheless, southeasterly near-surface winds occurred over a large area of the southern GrIS where surface melt was detected. These areas were also associated with a high total cloud fraction, as seen in Fig. 11b. Basins in the northern GrIS did not experience significant melt, and high pressure was located to the north over the Arctic Ocean.

On 12 August 1997, GrIS surface melt covered approximately 45% of the ice sheet, primarily covering southern and western basins 4, 5, 6, and 7 (Fig. 12). As seen in Fig. 12, localized anticyclonic circulation is found near and to the east of Cape Farewell on the day of greatest melt area, and near-surface winds again show southeasterly flow across the southern tip of the GrIS.

Over the period June–July 2002, northeastern basin 2 experienced two melt events (Fig. 13). The first occurred on 29 June and was associated with significant melt over the entire GrIS. Greater than 70% of the ice sheet experienced melt over the period 28–29 June. As seen in Fig. 13, sea level pressure of greater than 1020 hPa was
present to the south of Iceland. Near-surface wind flow from the southeast is found over the southern half of the ice sheet, and westerly flow is found over northeastern basin 2. A low pressure system was also present over the Arctic Ocean. On 14 July 2002, more than 70% of basin 2 experienced surface melt, in contrast with other areas of the ice sheet. On this day, surface winds over basin 2 were directly from the south.

Tedesco et al. (2016a) reviewed conditions for summer 2015 over the GrIS, in which anomalous, extensive surface melt in the northern regions of the ice sheet was present. Tedesco et al. (2016a) associated these conditions with monthly averaged high pressure anomalies over the central Arctic in summer, which promoted the advection of warm air from the east over northern basins. The year 2015 is not covered by the currently available MEaSUREs dataset; however, melt area may be approximated using the melting point in MERRA-2 skin temperature (e.g., Cullather et al. 2016). The resulting time series for summer 2015 shown in Fig. 14a indicates enhanced melt in northern basins 1 and 8 beginning on 2 July. The melt extent for basin 1 remains consistently high until 22 July. An examination of the prevailing daily conditions indicates a weak low pressure feature over the central Arctic at the beginning of the event (Fig. 14b), which generally provided westerly surface winds along the Arctic coast of the GrIS. Additional cyclonic circulation features passed along the northern GrIS coastline until 4 July, when high pressure begins to dominate the Arctic Ocean. As noted in Cullather et al. (2016), the temporal variability of the melt time series in northern basins is more muted than for elsewhere on the GrIS. A more persistent nature of melt in the northern basin may extend beyond the time scale for synoptic events and increase uncertainty in the regression analysis. These five anecdotal events underscore the relation of high pressure in the vicinity of Denmark Strait and southeasterly flow to enhanced surface melt, particularly over southern basins. Enhanced daily surface melt area over northern basins has an association with low pressure systems over the Arctic Ocean, which appear to enhance westerly winds along the northern edge of ice sheet. Below, the significance of this association is discussed further. Two significant melt events for northeastern basin 2 occurred in July 2002, but these events were dissimilar, suggesting varying mechanisms are responsible for melt.

4. Discussion

The novel aspects of this study have emphasized the consideration of both location and temporal scale in examining conditions that are associated with surface melt on the GrIS. The results shown indicate a general
Fig. 11. MERRA-2 fields of (a) sea level pressure and 10-m winds for 0000 UTC 10 Jul 1989 and 15 Jul 1989. Sea level pressure is contoured every 1 hPa, and wind vectors are shown in m s\(^{-1}\). (b) MERRA-2 cloud fraction for corresponding dates, contoured for every 0.05. MEaSUREs surface melt from passive microwave data is indicated with hatching.
FIG. 12. (a) Time series of daily normalized passive microwave-derived melt area for August 1997. Sea level pressure and 10-m winds for (a) 0000 UTC 11 Aug 1997 and (b) 00:00Z 12 Aug 1997, contoured every 1 hPa. Wind vectors are shown in m s$^{-1}$. 

(a) Total GrIS
(b) Basin 1
(c) Basin 2
(d) Basin 3
(e) Basin 4
(f) Basin 5
(g) Basin 6
(h) Basin 7
(i) Basin 8
FIG. 13. (a) Time series of daily normalized passive microwave-derived melt area for June/July 2002. Sea level pressure and 10-m winds for (a) 0000 UTC 29 Jun 2002 and (b) 0000 UTC 14 Jul 2002, contoured every 1 hPa. Wind vectors are shown in m s$^{-1}$. 

Legend:
- Total GrIS
- Basin 1
- Basin 2
- Basin 3
- Basin 4
- Basin 5
- Basin 6
- Basin 7
- Basin 8

Fig. 13. (a) Time series of daily normalized passive microwave-derived melt area for June/July 2002. Sea level pressure and 10-m winds for (a) 0000 UTC 29 Jun 2002 and (b) 0000 UTC 14 Jul 2002, contoured every 1 hPa. Wind vectors are shown in m s$^{-1}$. 
FIG. 14. (a) Time series of fractional basin area delimited by the 0°C isotherm of MERRA-2 skin temperature for the period 1 Jun to 31 Aug 2015. (b) Sea level pressure and 10-m winds for 0600 UTC 2 Jul 2015, contoured every 1 hPa. Wind vectors are shown in m s\(^{-1}\). (c) Averaged sea level pressure and 10-m winds for July 2015, contoured every 1 hPa.
agreement with previous studies on the role of atmospheric blocking in enhancing surface melt (Håkkinen et al. 2014; Hanna et al. 2016; McLeod and Mote 2016), although spatial heterogeneity is also found in the location of pressure anomalies. The patterns have similarity with summertime teleconnection features (e.g., Folland et al. 2009). The circulation patterns also suggest a role of synoptic systems over the central Arctic in increasing melt area for the northern parts of the ice sheet. Synoptic low pressure systems over the central Arctic Ocean provide eastward advection across the northern GrIS and enhance downslope winds in the northeastern basin. Regression patterns over other basins and for the full GrIS emphasize the role of clouds and enhanced moisture in communicating warmer air aloft to the surface. Melt area is enhanced in the presence of increased cloudiness and a large downwelling longwave radiative flux. This is consistent with the patterns described in Bennartz et al. (2013) and elsewhere concerning the role of mixed phase clouds in the Arctic (e.g., Kay et al. 2016; Van Tricht et al. 2016). In a recent study, Hofer et al. (2017) attributed recent reductions in GrIS SMB to a coincident trend in decreasing summer cloud cover, enhancing the melt–albedo feedback. MERRA-2 indicates a spatial pattern in the trend of seasonally averaged summertime cloud fraction, which compares closely to that shown for MODIS data in Hofer et al. (2017, their Fig. 1). The use of daily data in this study shows that decreasing seasonal-mean cloud fraction is not associated with melt events in southern and western basins of the ice sheet. A possible explanation for the seasonally averaged cloud fraction trend is that ambient temperatures are raised beyond the condensation point subsequent to a surface melt event. The analysis does not preclude prolonged surface mass loss via the ice/albedo feedback mechanism after the occurrence of large melt events, which rapidly alter surface properties including albedo (e.g., Tedesco et al. 2011, 2016b). While this study focused on satellite-derived melt area, Hofer et al. (2017) examined model-derived SMB. Surface melt is an important indicator of SMB, but models suggest that events in melt areal extent and events in SMB may differ (e.g., Cullather et al. 2016; Box et al. 2012). Nevertheless, the initial onset of a typical melt event in southern and western GrIS basins is found to be associated with enhanced rather than reduced cloudiness.

Similar to other models and analyses, the representation of MERRA-2 clouds is likely deficient in several aspects including phase and vertical structure. Lenaerts et al. (2017) examined reanalysis clouds against CloudSat–CALIPSO-derived observations and found that MERRA-2 produces too many liquid-water clouds at the expense of ice clouds. Alternatively, Liu and Key (2016) found reanalyses including MERRA-2 exhibit some capability for reproducing mean cloud anomalies. The surface representation of the GrIS in MERRA-2 has previously been examined in comparison to in situ flux and temperature data (Cullather et al. 2014; Reeves Eyre and Zeng 2017). Nevertheless, the regression analysis presented here emphasizes the timing of atmospheric moisture and its collocation with enhanced melt. Over Greenland, reanalysis conditions are also locally constrained by the local rawinsonde network (e.g., Robasky and Bromwich 1994).

The results shown are generally found to be robust. For example, Fig. 15 shows the regression of melt area on sea level pressure as in Fig. 4, but restricted to years prior to 2000, in which surface melt was generally less than observed in the twenty-first century. Figure 15 nevertheless indicates patterns that are similar to Fig. 4. In particular, the compact high pressure regression pattern south of Denmark Strait for southern basins 4–6 is similar in Figs. 4 and 15. The presence of a low pressure pattern over the central Arctic corresponding to basin 2 is also similar, though it is not significant for the earlier period. For northern basins 1 and 8, and for the regression using melt area for the total GrIS, the largest differences between the earlier period shown in Fig. 15 and the full time series shown in Fig. 4 are associated with the region to the north of the Canadian Arctic Archipelago. The patterns shown in Fig. 15 suggest a correlation with high pressure in the area, while the regression for the full available time period shown in Fig. 4 indicates regression values near zero and of no significance. These differences may be due to interannual variability and the overall lack of melt events in these basins prior to the most recent decade. Similar Arctic circulation anomalies can produce markedly different air temperature anomalies (Serreze et al. 2016). Nevertheless, the agreement with features affecting the central and southern basins suggests that mechanisms of recent surface melt are similar to those found throughout the 33-yr record. These mechanisms, such as atmospheric blocking, may have become more frequent or more severe in recent years (e.g., Hanna et al. 2015).

5. Summary
A regression analysis has been conducted using GrIS daily basin-scale melt area and anomalies of MERRA-2 variables for atmospheric circulation, cloudiness, and surface radiative fluxes over the period 1980–2012. The analysis is conducted to understand the relation of surface melt to circulation patterns on submonthly time scales, to gain insight on the regional variability of conditions associated with surface melt, and to examine
patterns associated with melt over the entirety of the satellite era.

For basins in the southern GrIS, regression patterns indicate a compact high pressure anomaly over the southeastern Greenland bight—to the south of Denmark Strait. Surface melt over northern and northeastern basins are generally associated with low pressure over the central Arctic Ocean. These patterns allow for the northward advection of warm, moist air over the central and western side of the ice sheet. Basin-scale surface melt is generally associated with an enhanced downwelling shortwave flux over the eastern edge of the ice sheet but a decreased shortwave flux and an enhanced downwelling longwave flux over the western and southern drainage basins where melt is more prevalent. Spatial heterogeneity is apparent in the patterns. The occurrence of melt events requires blocking to occur at specific locations in order to enhance melt for particular locations on the ice sheet. For basins to the north and east, the direct atmospheric circulation and advection seem less connected to conditions on the ice sheet. For basin 2, there is a suggestion of downslope winds and adiabatic heating that may be associated with

**FIG. 15.** As in Fig. 4, but for the period 1980–99, in hPa.
melt in the northeast. Melt in northeastern basin 2 has occurred less frequently in the past, and an examination of significant melt events finds differing circulation patterns. The geography does not readily allow for direct heating of the location through advection. In basin 1, the circulation anomalies do not suggest direct advective warming of the ice sheet surface or warming of the atmosphere above the ice sheet. The downwelling longwave regression patterns are consistent with the mechanism described by Bennartz et al. (2013) of warm, moist air advecting across the western side of the ice sheet, where longwave energy fluxes are then emitted toward the surface (see also Mattingly et al. 2016). Basin 2 indicates more homogenous longwave heating over the GrIS, suggesting the need for widespread heating to affect this basin. The downwelling shortwave patterns generally have a meridional character, with western regression values contrasting with eastern values of opposite sign. Negative values are associated with anomalies in the received shortwave flux at the surface, which is indicative of enhanced cloud cover and atmospheric moisture. In agreement with Enderlin et al. (2014), the consistency of the patterns suggest similar mechanisms are associated with surface melt throughout the time series examined, which extends beyond the significant melt events documented over the last decade. An increased frequency of associated conditions (e.g., Hanna et al. 2015), or enhanced severity of such patterns, are implied reasons for observed trends in recent years.

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