Evaluation of Surface and Near-Surface Melt Characteristics on the Greenland Ice Sheet
using MODIS and QuikSCAT data

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Abstract

The Greenland Ice Sheet has been the focus of much attention recently because of increasing melt in response to regional climate warming. To improve our ability to measure surface melt, we use remote-sensing data products to study surface and near-surface melt characteristics of the Greenland Ice Sheet for the 2007 melt season when record melt extent and runoff occurred. Moderate Resolution Imaging Spectroradiometer (MODIS) daily land-surface temperature (LST), MODIS daily snow albedo, and a special diurnal melt product derived from QuikSCAT (QS) scatterometer data, are all effective in measuring the evolution of melt on the ice sheet. These daily products, produced from different parts of the electromagnetic spectrum, are sensitive to different geophysical features, though QS- and MODIS-derived melt generally show excellent correspondence when surface melt is present on the ice sheet. Values derived from the daily MODIS snow albedo product drop in response to melt, and change with apparent grain-size changes. For the 2007 melt season, the QS and MODIS LST products detect 862,769 km² and 766,184 km² of melt, respectively. The QS product detects about 11% greater melt extent than is detected by the MODIS LST product probably because QS is more sensitive to surface melt, and can detect subsurface melt. The consistency of the response of the different products demonstrates unequivocally that physically-meaningful melt/freeze boundaries can be detected. We have demonstrated that these products, used together, can improve the precision in mapping surface and near-surface melt extent on the Greenland Ice Sheet.
Introduction

Much of the Arctic has warmed in recent decades (Serreze et al., 2000), and remote sensing technology has been instrumental in quantifying the attendant snow and ice changes. Recently there has been a focus on the Greenland Ice Sheet because of its importance to sea-level rise, and the observations of increasing Arctic surface temperatures over the last few decades (Comiso, 2006; Wang and Key, 2005; Box, 2002), and ice sheet mass loss over the last few years (e.g., Krabill et al., 2004; Luthcke et al., 2006; Rignot et al., 2008). Melting of the entire Greenland Ice Sheet would contribute approximately 7 m to sea level (Gregory et al., 2004). If the climate continues to warm at the current rate, mass loss of the Greenland Ice Sheet will likely accelerate sea-level rise.

Field work and weather station data, especially from automatic-weather stations (AWS) (Steffen and Box, 2001; van de Wal et al., 2006), have been useful for quantifying air and surface-temperature changes, as have remotely-sensed data. It is vital to improve our ability to monitor and predict the quantity of meltwater emanating from melting ice on Greenland.

In this work, we blended three daily products derived from two different instruments: the Moderate-Resolution Imaging Spectroradiometer (MODIS), and the SeaWinds scatterometer on the QuikSCAT (QS) satellite. The products are: MODIS-derived surface albedo, MODIS-derived surface temperature and QS-derived melt. MODIS products are produced during clear-sky conditions only, while QS melt maps are obtained
during all sky conditions. We provide a quantitative comparison of daily melt derived
from the various products and discuss the physical basis for melt detection. We also
delineate surface and near-surface melt extent, detect incipient melt, and monitor the
progression of melt. Results show the initiation, progression, extent and cessation of melt
for the 2007 melt season which is known to have experienced an unusually large melt
extent on the Greenland Ice Sheet (Mote, 2007; Tedesco, 2007; Mernild et al., 2009).

**Background**

Increased melt has been measured on the Greenland Ice Sheet using both microwave data
(Mote and Anderson, 1995; Abdalati and Steffen, 2001; Steffen et al., 2004) and infrared
(IR) data (Wang and Key, 2003 and 2005; Comiso, 2006; Hall et al., 2008a). These
studies have largely been accomplished using individual sensors such as the passive-
microwave instrument on the Scanning Multichannel Microwave Imager (SSM/I),
surface-temperature data from the Advanced Very High Resolution Radiometer
(AVHRR), MODIS and scatterometer data from QS. Mass loss of the ice sheet has also
been reported using aircraft and ICESat laser altimetry (Krabill et al., 2004; Zwally et al.,
2005), and Gravity Recovery and Climate Experiment (GRACE) data (Luthcke et al.,
2006). Krabill et al. (2004) found thinning along the ice sheet margins and some
thickening at the higher elevations which has since been confirmed by independent
studies using different instruments (see, for example, Luthcke et al., 2006).
There has also been a great deal of work using satellite remote sensing to measure melt extent (for example, Wismann, 2000; Abdalati and Steffen, 2001; Nghiem et al., 2001; Steffen et al., 2004; Fettweis et al., 2007; Mote, 2007; Tedesco, 2007; Wang et al., 2007; Hall et al., 2008a; Tedesco et al., 2008; Sharp and Wang, 2009), clear-sky surface temperature (Stroeve and Steffen, 1998; Comiso et al., 2003 and 2006; Hall et al., 2008a & b) and albedo (Nolin and Stroeve, 1997; Stroeve et al., 1996, 1997, 2005 & 2006; Nolin and Payne, 2007), and changes in melt-related surface characteristics of the Greenland Ice Sheet. Specifically regarding the 2007 melt season, Mote (2007) showed that there were large areas of anomalously-high melt frequency in the summer of 2007, south of 70°N, and Hall et al. (2008a) showed that some drainage basins are experiencing earlier melt initiation in southern Greenland. Some details of the algorithms and products used in this work follow.

Theoretical Considerations

Emissivity and Land-Surface Temperature (LST). Emissivity is an intrinsic property of the surface and is independent of the temperature. (See Hook et al. (2007) for further discussion.) The surface emissivity is defined as the ratio of the actual radiance emitted by a given surface to that emitted by a perfect radiator at the same kinetic temperature. Salisbury et al. (1994) show that snow emissivity departs significantly from perfect radiator behavior in the 8 – 14 μm part of the spectrum. Emissivity of snow varies with liquid water content and snow grain size especially at larger grain sizes (Salisbury et al.,
To obtain snow or ice LST with an accuracy of 0.1°C, the emissivity must be known to within 0.1% (Stroeve et al., 1996).

**Albedo.** Snow has a very high reflectance in the visible (VIS) wavelengths (0.4 – 0.7 μm), up to nearly 100% at the shortest visible wavelengths, but a much lower reflectance in the near-IR (NIR) (0.7 – 2.5 μm) and short-wave IR (SWIR) wavelengths, even near zero around 1.6 μm. In the NIR, snow is very sensitive to grain size changes, thus albedo decreases when grain size increases (Choudhury and Chang, 1979), and melting enhances grain growth (Dozier et al., 1981). In fact, broadband snow albedo can decrease by >25% within a few days after grain growth begins (Nolin and Liang, 2000).

**Scatterometry.** A scatterometer is a stable and accurate radar. It transmits electromagnetic waves toward a target and measures backscatter, characterizing the scattering of the waves by the target back to the radar. The snow scattering physics have been modeled by a number of researchers (e.g., Tsang et al., 1985; Ulaby et al., 1981; Nghiem et al., 1995). With a wavelength of 2.24 cm in free space (corresponding to a Ku-band frequency of 13.4 GHz), QS backscatter is highly sensitive to snow wetness, allowing Ku-band backscatter to be used for snowmelt detection (Nghiem and Tsai, 2001; Nghiem et al., 2001).

This is because, in wet snow, liquid water (no salinity) has an imaginary part of about 38 ε_0, approximately 19,000 times larger than that of non-melting ice (Klein and Swift, 1977, Tiuri et al., 1984). Furthermore, the large difference in the imaginary part of the
permittivity of dry and wet snow signifies that Ku-band waves can effectively penetrate
the surface layer of refrozen snow to detect subsurface wet snow due to an internal snow
temperature profile that has not yet reached the freezing point.

Data Products from MODIS and QuikSCAT

Instruments. MODIS is a 36-channel, polar-orbiting, across-track scanning
spectroradiometer that images all areas on Earth every 1 – 2 days (Barnes et al., 1998).
The first MODIS was launched on the Terra satellite in December 1999 and the second
MODIS was launched on the Aqua satellite in May 2002. The MODIS instruments have
seven spectral bands in the 0.4 – 2.5 µm range that are relevant for calculation of spectral
albedo at either 250- or 500-m spatial resolution. IR channels 31 and 32 (Table 1), are
used to calculate daily LST at 1-km spatial resolution.

Table 1. MODIS bands used in this work*.

<table>
<thead>
<tr>
<th>MODIS band</th>
<th>Bandwidth (µm)</th>
<th>Product</th>
</tr>
</thead>
<tbody>
<tr>
<td>1</td>
<td>620 – 670</td>
<td>MOD10A1 &amp; MCD43 (albedo)</td>
</tr>
<tr>
<td>2</td>
<td>841 – 876</td>
<td>MOD10A1 &amp; MCD43 (albedo)</td>
</tr>
<tr>
<td>3</td>
<td>459 – 479</td>
<td>MOD10A1 &amp; MCD43 (albedo)</td>
</tr>
<tr>
<td>4</td>
<td>545 – 565</td>
<td>MOD10A1 &amp; MCD43 (albedo)</td>
</tr>
</tbody>
</table>
### Table 1

<table>
<thead>
<tr>
<th>No.</th>
<th>Time Range</th>
<th>Product</th>
</tr>
</thead>
<tbody>
<tr>
<td>5</td>
<td>1230 – 1250</td>
<td>MOD10A1 &amp; MCD43 (albedo)</td>
</tr>
<tr>
<td>6</td>
<td>1628 – 1652</td>
<td>MOD10A1 &amp; MCD43 (albedo)</td>
</tr>
<tr>
<td>7</td>
<td>2105 – 2155</td>
<td>MOD10A1 &amp; MCD43 (albedo)</td>
</tr>
<tr>
<td>31</td>
<td>10.78 – 11.28</td>
<td>MOD11 (LST)</td>
</tr>
<tr>
<td>32</td>
<td>11.770 – 12.270</td>
<td>MOD11 (LST)</td>
</tr>
</tbody>
</table>

*Additional bands (not shown) are used in the input products for the products listed; an example is the MODIS cloud mask (MOD35) which is input to MOD10A1, MCD43 and MOD11.

The SeaWinds scatterometer aboard the QS satellite was launched in June 1999 and has been collecting backscatter data over a swath of 1400 km for the horizontal polarization (H) and 1800 km for the vertical polarization (V). QS acquires backscatter data over the entire island of Greenland two times per day. There are two backscatter products in the QS science dataset with different spatial resolutions (Jet Propulsion Laboratory, 2006). The “egg” data backscatter product has a resolution of 25 km, and the “slice” data have a sub-footprint resolution of about 12 km (Jet Propulsion Laboratory, 2006). The egg data have a higher accuracy and are used in this work for detection and mapping of melt on the ice sheet.

**Daily MODIS land-surface temperature (LST) product (MOD11A1).** We use the 1-km pixel resolution MODIS LST standard daily product (MOD11A1) of Wan et al. (2002) from Collection-5 reprocessing (Wan, 2008), which provides surface temperatures over
the Earth's land areas under clear-sky conditions. The LSTs over snow and ice are accurate to within ±1°C (Wan et al., 2002; Hall et al., 2008b). Relative to other satellite LST results from the Advanced Spaceborne Thermal Emission and Reflection Radiometer (ASTER) and Landsat Enhanced Thematic Mapper Plus (ETM+), Hall et al. (2008b) show relative agreement of ±0.5°C. We do not know if the accuracy of the MOD11A1-derived LSTs varies with temperature. For example, is the accuracy higher, lower or equal at 0° and -20°C over ice and snow? This is an interesting research question that should be pursued. Nevertheless, the ±1°C accuracy reported by Wan et al. (2002) seems reasonable at a variety of ice-surface LSTs, and may be a conservative accuracy estimate at ice-surface LSTs of –15 to 0°C based on work by Hall et al. (2008b).

To determine the LST from an instrument that has two IR channels, one must correct for absorption and reemission of radiation by atmospheric gases, predominately water vapor. The "split-window" method is widely used to achieve some correction for atmospheric effects because the measured temperature difference between the two IR channels is proportional to the amount of water vapor in the atmosphere (Key and Haefliger, 1992). To compute the LST to develop the MOD11_L2 product, the emissivity must be prescribed. (MOD11_L2 is a Level 2 swath product.) For bands 31 and 32, the emissivities used in the algorithm to compute LST over the Greenland Ice Sheet are 0.993 (for band 31) and 0.990 (for band 32), and do not vary seasonally nor with viewing angle.
Wan et al. (2002) calculated coefficients in the generalized split-window LST algorithm by interpolation on a set of multidimensional look-up tables obtained by linear regression of MODIS simulation data from radiative-transfer calculations over a wide range of surface and atmospheric conditions. The following MODIS products are input to the MOD11_L2 LST algorithm: sensor radiance (MOD021km), geolocation (MOD03), cloud mask (MOD35_L2), atmospheric temperature and water vapor (MOD07_L2), land-cover (MOD12Q1) and snow cover (MOD10_L2). For this work, a pixel is considered “melt” when the LST ≥ -1°C and this simple binary algorithm constitutes the LST melt “product.”

Albedo products.

Daily MODIS snow albedo standard product (MOD10A1). The daily MODIS snow albedo product is a data layer in the snow-cover product, MOD10A1 (Riggs et al., 2006; Hall and Riggs, 2007). The daily snow albedo product was developed by Klein and Stroeve (2002), with heritage from the work of Nolin and Stroeve (1997), Stroeve et al. (1997) and Liang (2000). The product was designed to provide global daily broadband albedo measurements for areas mapped as snow by the MODIS snow algorithm to augment the MODIS 16-day albedo product (MCD43) that currently provides 8-day maps of albedo globally at 500-m resolution (Schaaf et al., 2002) using both Terra and Aqua MODIS data (see section below). MOD10A1 provides more frequent, though less robust, albedo maps than does the MCD43 product. We use MOD10A1 for this work instead of MCD43, because MOD10A1 has a higher temporal resolution, and because absolute albedo values are not required.
To develop the MOD10A1 product, snow albedo is only calculated under clear-sky conditions as determined using the MODIS cloud mask, MOD35 (Ackerman et al., 1998; Platnick et al., 2003). A narrowband or spectral reflectance is calculated for each of the seven MODIS “land” bands (Table 1), then combined into a spectrally-integrated broadband albedo. Snow is treated as an anisotropic surface (Klein and Stroeve, 2002). Albedo is calculated using various inputs such as the MODIS surface reflectance product (MOD09), land cover product (MOD12Q1), and a Digital Elevation Model (DEM) (Klein and Stroeve, 2002). Models of the Bidirectional Reflectance Distribution Function (BRDF) of snow are created using the discrete-ordinate radiative transfer (DISORT) model of Stamnes et al. (1988) to correct for anisotropic scattering effects over non-forested surfaces.

Several validation efforts have shown that the MODIS daily snow albedo products are useful over large, flat areas. Stroeve et al. (2006) assessed the accuracy of the MOD10A1 (Terra) and MYD10A1 (Aqua) daily snow albedo products over the Greenland Ice Sheet. They compared the products with surface albedo measurements on the ice sheet from five AWS during the summer of 2004, and found general agreement of the MODIS measurements with the station data. RMSE for the MOD10A1 was 0.067, and 0.075 for MYD10A1. Tekeli et al. (2006) studied the MOD10A1 product in the mountains of the Karasu Basin in the headwaters of the Euphrates River in eastern Turkey, and found that the MOD10A1 product overestimated albedo by ~10% compared to in-situ measurements. Additional work by Sörman et al. (2006) showed the
MOD10A1 product to be good under conditions of low relief and deep snow cover but results were found to be unreasonable in areas with rugged relief, shallow snow cover and over anisotropic surfaces such as forests that were assumed (in the MODIS daily snow albedo algorithm) to be Lambertian.

16-day MODIS standard BRDF/Albedo product (MCD43C3). The focus of this paper is on the relative change in albedo in relation to melt characteristics rather than on the absolute value of albedo per se. Thus, the absolute calibration of the different albedo products is beyond the scope of this paper but we compare the state-of-the-art albedo product from MODIS (MCD43) with MOD10A1, to address the suitability of MOD10A1 for monitoring daily albedo of the ice sheet (also see Methodology section).

The MODIS BRDF/Albedo product uses all cloud-free, directional surface reflectances (MOD09) available over a 16-day period to retrieve an appropriate form of the RossThickLiSparseReciprocal BRDF model every 8 days at a 500-m resolution (Lucht et al., 2000; Schaaf et al., 2002 & 2008). A high-quality retrieval is only possible when sufficient cloud-free observations that adequately sample the viewing hemisphere are available. If only a very limited number of observations can be used, then the algorithm relies on a backup method where static field-based BRDFs are used as a priori information and coupled with the few observations to estimate the albedo. For the present work, we used the black-sky albedo (BSA) product, MCD43C3, which is provided at 0.5°-resolution on a latitude/longitude grid. (MCD refers to the MODIS combined Terra and Aqua product.) BSA is directional hemispherical reflectance. Also
The accuracy of the 16-day albedo products over snow and ice surfaces has been studied. Stroeve et al. (2005) found that the MOD43 albedo product retrieves snow albedo with an average RMSE of 0.07 as compared to the station measurements, which have an RMSE uncertainty of 0.035. Greuell et al. (2007) validated the 1-km resolution black-sky MODIS Terra 16-day albedo product, MOD43B3, over a glacier in Svalbard using in-situ data. They found that the highest-quality albedo data in MOD43B3 provided an RMSE of 0.04.

In addition to the validation studies discussed earlier, we compared the MOD10A1 products with a daily version of the MODIS BRDF/Albedo standard product (MCD43C3) using the "backup" algorithm approach developed by Strugnell and Lucht (2001). This was done to further assess the accuracy of MOD10A1 for the present study. In general, MOD10A1 gives somewhat higher albedo values than does MCD43B3, especially in northern Greenland, and along the western margin of the ice sheet. The greatest differences in albedo are found in northern Greenland, and range generally from >0.1 to ~0.2 meaning that MOD10A1 provides higher values in those areas (Hall et al., 2009). Parts of the ice sheet in southern Greenland show slightly higher albedo values in the MCD43B3 product compared to MOD10A1. Though the absolute accuracy of the albedo in MOD10A1 has not been assessed fully with respect to in-situ data (Stroeve et al., 2006; Greuell et al., 2007) and MCD43C3 (Hall et al., 2009), the relative accuracy of
the MOD10A1 product is excellent over the ice sheet, and the relative accuracy is what is most relevant to this work.

Daily QuikSCAT melt special product. The diurnal difference method was developed by Nghiem et al. (2001) to monitor the snowmelt process. The algorithm is based on diurnal backscatter difference, a relative quantity between morning and afternoon measurements in half a day to identify current melt, reduced melt, or refreezing conditions (Steffen et al, 2004; Nghiem et al., 2005). The QS diurnal algorithm does not require the snow to be completely refrozen (zero liquid water) in the early morning. QS can detect melt as long as there is a difference in the amount of meltwater in snow between morning and evening, causing a difference in the diurnal backscatter. For the case of light melt when there may be some daytime meltwater that fully refreezes during the night (no meltwater in snow), QS sensitivity for melt detection is maintained due to the large difference, by more than three orders of magnitude, in the imaginary part of solid ice and that of liquid water.

The diurnal method is based on the relative backscatter difference and not on absolute backscatter. With this relative difference approach, the advantages include independence from: absolute backscatter for different snow classes and snow conditions; scatterometer long-term gain drift; orbital changes of the satellite; and cross-calibration between QS and future satellite scatterometers. It also allows the detection of both snowmelt and refreezing. These advantages are not possible with a melt detection method based on a threshold of absolute backscatter, which is dependent on snow grain size, density, accumulation, and ice layer formation created in previous melt seasons (Nghiem et al.,
Therefore, the use of the absolute backscatter is inherently complicated and may lead to biases and inconsistencies both in space and time.

Regarding data resolution, the QS egg data at 25-km resolution have the highest accuracy (0.2 dB for 3σ) for melt detection, which is better than the slice data at 12-km resolution with a lower accuracy resulting in more melt misclassification. A higher resolution of QS data can also be derived with the deconvolution method, however, it requires that the backscatter remains unchanged in each high-resolution pixel during the period of data acquisition (period of a day to a week depending on the scale of the enhanced resolution) used in the resolution enhancement process as stated by Early and Long (2001). This requirement invalidates the use of QS data at a high resolution obtained by the deconvolution method for snowmelt detection because backscatter can change significantly (by as much as an order of magnitude or more) within a few hours or between ascending and descending passes in half a day when snowmelt occurs (Nghiem et al., 2001 and 2005; Steffen et al., 2004). Furthermore, the deconvolution method also needs the merging of data from both ascending and descending passes to have a sufficient number of data samples to significantly enhance the resolution. In that case, one is forced to use the method based on backscatter threshold, leading to inherent inconsistencies and biases.

We implement here a simple additional step to require that melt occurs at a given pixel in two consecutive days for the pixel to be identified as a melt pixel using QS egg data. This product is called the "QS consistent melt" product (QCM) to distinguish it from the
"QS transient melt" product (QTM) when a pixel is classified as melt as long as a transient melt is detected in a single day. Compared to QTM, QCM reduces the inclusion of isolated melt events due to transient weather conditions such as warm air advection associated with storms from the south or warm fronts from the ocean. With the exclusion of transient isolated melt cases, the QCM melt extent is smaller than the corresponding QTM extent. QTM was used to study transient melt events in the dry snow facies of the Greenland Ice Sheet in the anomalous melt season of 2002, and the results indicate that such isolated melt events are short lived and infrequent (~1 day) (Steffen et al., 2004; Nghiem et al., 2005). When the difference between QTM and QCM (QTM-QCM) is used, the variability of isolated or transient melt events can be quantified. This can be related to sensible heat advection and synoptic atmospheric dynamics, which is planned for future study. However, for this work, the use of the QCM product is necessary to allow a consistent comparison with the MODIS melt detection algorithm.

Methodology

All MODIS and QS data were registered to an Albers conical equal-area projection. Daily (MOD10A1) albedo maps were produced, and the MODIS LST and QS melt product results were blended into a single grid. Using the QS melt product along with the MODIS LST melt product, various categories of melt are provided in the blended maps: 1) no melt, or “snow,” either MODIS LST or QS maps (shown as “grey” on the blended maps and called “Both Snow”); 2) melt on both MODIS LST maps and QS (shown as “red” and called “Both Melt”); 3) melt on the MODIS LST map and “Reduced Melt” on
the QS map (shown as “orange” and called “MODIS Melt/QS Reduced Melt”); 4) QS-
derived refrozen snow (shown as “purple hatched” and called “QS Refrozen Snow”); and
5) snow on MODIS and melt on QS (shown as “blue” and called “MODIS Snow and QS
Melt”).

“Reduced melt” means that QS algorithm detects melt, but the rate or intensity of melt is
lower compared to the previous day’s melt conditions. Since the QS algorithm detects
melt based on differing amounts of liquid water in snow (i.e. snow wetness) between
morning and afternoon, if there is a smaller diurnal change in backscatter (i.e., less
difference in liquid water content) relative to a larger backscatter change (> 1dB) in
previous days, it means that there is less daytime heating and thus less melting, and
consequently a slower melt rate (which is thus called “Reduced Melt” on the QS melt
product).

A series of transects from west to east was developed to illustrate the location of changes
in albedo (from MOD10A1) with respect to the melt categories on the blended maps.
Elevation is derived from the DEM of Bamber et al. (2001). The location (in km) on the
x-axis in each transect figure represents number of kilometers from the beginning of the
transect, from west to east.

To identify the geophysical meaning of the melt determined by the MODIS-QS
composite map, we investigate seasonal melt evolution over various melt regions of the
Greenland Ice Sheet, from incipient through active melt, to freeze-up. This approach
allows us to tie the MODIS-QS blended melt classes to physical parameters such as

elevation, temperature and albedo.

We also analyze maximum melt for the 2007 melt season from MODIS LST and QS, and
compare the melt-season results from both products on a single map. And we produced a
map of minimum albedo for the 2007 melt season to compare with the combined LST-QS
seasonal melt map.

The map of minimum albedo was developed in the following way. First, sharp dips in
the albedo were minimized. The sharp albedo dips are generally caused by unmasked
clouds, but may also be related to the presence of melt ponds (see Box and Ski, 2007;
Sneed and Hamilton, 2007). Sneed and Hamilton (2007) discuss melt ponds and
extensive areas of non-ponded surface water. These areas could influence the albedo
within the MODIS pixel. To eliminate or minimize inclusion of albedo dips, each pixel
value of albedo was compared to pixels from the two previous days of conservatively
non-cloudy data. If the current day albedo was a new minimum and had a lower value
than that of the two previous days by 10 percentage points or more, then it was
considered a “dip” and eliminated. If the albedo were lower by less than 10 percentage
points for both of the previous two good days, then it was considered an acceptable value,
and the current day's albedo was recorded as the lowest albedo value for that pixel.
Results

The MODIS daily snow albedo product is the most sensitive of the three products to surface changes. The QS melt product is the most sensitive to surface and near-surface (centimeters to decimeters) melt intensity, and though the MODIS LST product is not sensitive to melt intensity because of the binary nature of the algorithm used for this work, it is still highly effective in detecting active surface melting, and can be used alone, or in conjunction with other data to detect surface melt/freeze boundaries.

Incipient melt phase. Lowering of the albedo on the ice sheet was first seen around 22 March (where the albedo decreased from ~95% to as low as ~80% in the southern part of the ice sheet). The LST-QS blended maps do not show sustained melt until late May/early June 2007 (on the periphery of the ice sheet), so it is highly unlikely that the MODIS daily snow albedo algorithm, MOD10A1, was detecting surface melt in March and April in the higher-elevation parts of the ice sheet. A likely explanation for the albedo decrease beginning in mid-March is that shadows from sastrugi and other wind-sculpted snow features began to change, causing a reduction in the albedo; this is particularly likely at high solar-zenith angles. According to Stroeve et al. (2005), undulations and wind-sculpted features such as sastrugi, represent altered snow grain sizes and introduce shadowing effects to the snow surface that can lower the albedo.

Active melt phase. Melt is often detected first with the QS product and soon after with the MODIS LST. On 1 June 2007, in the southwestern margin of the ice sheet, QS shows
extensive melt on the ice sheet margin (red, orange, and blue areas on blended map in Figure 1a), with less melt observed by the MODIS LST product. On the next day, 2 June, the extent of melt, as observed by the MODIS LST product, increased (red and orange areas in Figure 1b). By 3 June, both the LST and QS products show extensive melt in the southwestern margin of the ice sheet (Figure 2b). The albedo map (Figure 2a) also indicates melting as evidenced by the significantly reduced albedos (<75%) along the southwestern margin of the ice sheet as compared to inland values. Though not shown, a similar pattern is evident for 26 - 27 June, 1 - 2 July and 11 - 12 August, as well as on other dates, where QS detects melt first, and then the MODIS LST product detects melt after a 1- to 2-day delay. This delay may be caused by one or a combination of three physical reasons: (1) meltwater may be present below a frozen surface; this can be detected only by QS; or (2) QS is more sensitive to melt detection than is the MODIS LST; or (3) MODIS may be missing surface melt if it is not mapping the area at the warmest time of the day, while the QS algorithm detects any melt between 06:00 and 18:00 local time (data at the outer sides of each swath can be earlier or later than the local time of the data acquired at the swath center due to the large swath width).

On 3 June on the eastern part of the ice sheet, the east transect plot (Figure 2c) illustrates a dramatic drop in albedo (from ~83 to ~25%) at the snowline from the frozen to the melted parts of the ice sheet surface between ~42 and 52 km from the beginning of the transect (see change from grey to orange area). The solid black line represents albedo. All of the products respond to a sudden change from a frozen surface to a melted surface from west to east. Note the sharp drop in elevation coincident at this location as well,
which is most probably the controlling mechanism for the change in surface state. The
dashed black line represents elevation.

Turning to the southwest transect, also on 3 June, we see albedo variability that is likely
caused by inhomogeneity in surface melt within the area of melt on the blended map
(orange and red areas in transect in Figure 2d). Surface melt features such as melt ponds
cause changes in albedo between ~10 to 91 km from the beginning of the transect. Snow
albedo increases from a location on the transect, from ~24 to 137 km, to a maximum of
~80%, in response to smaller grain sizes at the higher elevations. Note the somewhat
abrupt increase in albedo before 114 km when melted snow as detected by QS (blue)
becomes frozen (grey), a likely result of decreased surface snow grain size.

MOD10A1 is sensitive enough to grain size changes so that it can detect conditions
associated with different melt intensities. The lowest albedos (<25%) observed in 2007
correspond to bare glacier ice. The QS and MODIS LST melt products do not distinguish
bare ice and/or impurity-rich ice from snow-covered ice when the surface is dominated
by a wet layer. The distinct albedo zones in southwestern Greenland seen in Figure 2a,
and in Figure 3a on 5 July indicate sustained melt features and they correspond with the
MODIS LST and QS melt when both show active melting (red on the blended maps in
Figure 3b). This is probably an area containing bare ice on 5 July.

On 5 July 2007, a gradual lowering of the albedo is seen in the east transect (Figure 3c)
from the zone of snow (grey) where the albedo is ~85%, to the zone of refrozen snow
(purple hatched area over grey) accompanying a grain-size increase from frozen snow to refrozen snow. Albedo continues to decrease in the zone of refrozen snow. Then there is a sharp drop in albedo (from ~75 to 65%) from the zone of refrozen snow to the zone of wet snow / reduced melt (orange) (Figure 3c) at a location of ~ 304 km.

Also on 5 July, Figure 3d, a transect in southwestern Greenland, indicates a range of albedos (from ~<35 to 70%) within the QS-MODIS zone of active melting (red) implying albedo sensitivity to melt intensity (or possibly to impurity-rich ice) whereas the QS and LST melt algorithms simply identify this area as melt. Also in the southwest transect (Figure 3d), albedo rises sharply from an area of melt which is detected by both MODIS and QS (red), to melt detected by QS only (blue) at 84 km where the surface is frozen according to the LST product. The albedo continues to increase, but gradually from melted (blue) to refrozen snow (purple hatched over grey) and then to the region of dry snow (grey), again probably in response to smaller grain sizes from melted and refrozen to dry snow where no melt was detected by LST and QS.

By 4 August 2007 (Figure 4a, b & c), most of the inland parts of southern Greenland are refrozen (see purple hatched over grey area on Figures 4b and c), with neither MODIS LST nor QS indicating active melt except near the ice sheet margins. The transect (Figure 4c) across southern Greenland shows that the albedo is abruptly higher at a location of ~35 km, moving eastward from melt detected by both MODIS LST and QS (red) where the albedo is as low as ~30%, to melt detected by QS only (blue) where the albedo rapidly increases to nearly 80%. The MODIS LST and albedo products are
consistent here: the large increase in albedo is coincident with the LST product changing from detecting a melted to a frozen surface at ~35 km. In the region of melt observed by QS only (blue) after 35 km, the albedo changed from a low of ~30% to a high of ~78%.

The existence of QS subsurface melt is physically consistent with this observation since a refrozen surface can maintain the freezing condition for new snow from either snow drift or snowfall with a higher albedo. The steep elevation increase in this area is likely responsible for changes in surface temperatures and in melt states with different wetnesses corresponding to the relative changes in albedo. Or, the albedo dip at ~35 km may signify the presence of impurity-rich ice (J. Box written communication).

*Extreme melt episode.* On 13 August 2007 (Figure 5a, b & c) there was a melt event in which active melting is evident on both the LST and QS products (red, orange and blue in southern Greenland in Figure 5b). The MODIS daily snow albedo map, Figure 5a, illustrates lowered albedo in southern Greenland as compared to the previous day, probably due to larger grain sizes resulting from surface melt on 13 August (Figure 6).

Albedo along the westernmost part of the transect is shown in Figure 6 for 12 and 13 August, with a lowering of the albedo during the melt event on 13 August. Also on 13 August, extensive melt is observed at the eastern ice sheet margin (red and orange) in Figures 5b and c.

A transect extending from west to east across the southern part of the ice sheet is shown in Figure 5c. Steep increases in albedo occur within the melted (red and orange) areas to a maximum of ~75%, resulting from lowered surface temperatures (a transition from a
melted to a frozen surface) coincident with steeply increasing elevation (see dashed line). Note the abrupt albedo increase when the MODIS LST product indicates a change from a melted to a frozen surface (from the red to blue areas at the location of just before 231 km in Figure 5c). (This was also noted on Figure 3d.) Again, the consistency of the melt states identified by the LST and QS products [from melt (red), to a frozen surface with subsurface melt (blue), to dry snow (grey)], with the albedo product confirms that a geophysical boundary is identified. Both MODIS products are responding to the abrupt change from a wet to a frozen surface while QS continues to detect melt below the surface (blue) or is responding to melt that occurred sometime during that day approximately between 06:00 and 18:00 local time that was missed by the MODIS products that are based on instantaneous “snapshots” in time, of the surface.

Hanna et al. (2008) show that the summer of 2007 was the second warmest since 1961, and Mernild et al. (2009) show record melt extent and runoff from the ice sheet in 2007. During the summer of 2007, some locations on the ice sheet experienced as many as 50 more days of melt than the 1973 – 2007 average (Mote, 2007). T. Mote (written communication) identified an extensive area of melt on 13 August 2007 in southern Greenland using passive-microwave data that is roughly comparable in size, though larger, than the melt region identified using the MODIS LST map on that same day. Tedesco (2007) also noted an increase in frequency of melt in regions above 2000 m.

**Maximum melt extent in 2007 melt season.** The maximum extent of melt detected by the MODIS LST (766,184 km²) and QS (862,769 km²) melt products is shown in Figure 7.
MODIS and QS generally agree (89%) in the detection of seasonal melt extent with about 11% larger extent detected by QS. Differences occur at higher elevations farther inland near the boundary of the maximum melt extent. Melt extent reached higher elevations as measured by QS probably because of the capability of the QS to detect sub-surface as well as surface melt. In addition, the peak temperature and melt of the ice sheet probably occurs at about 13:00 – 14:00 local time on most days. The QS diurnal algorithm is based on the presence of melt between 06:00 and 18:00 local time, which includes the hours of peak melting and MODIS swaths from those hours may not always be selected by the MODIS LST algorithm, or the swath observations (which are instantaneous), at those hours might have been cloud obscured. Thus less melt is likely to be detected by the MODIS LST product when those circumstances prevail.

Freeze-up phase. By 27 August 2007 (images not shown), the albedo remained low at the ice margin in both eastern and western Greenland (but it is more pronounced in western Greenland because the ablation zone is wider there); in addition, the MODIS LST map indicates that melt was occurring in those locations, while the QS map indicates reduced melt. As snow continued to fall and as temperatures decreased, the albedo increased and the blended map shows increasingly less melt along the ice margins as the freeze-up period progressed.

Discussion of uncertainties
Detection of subsurface melt by QuikSCAT. QS indicates significantly more melting in southern Greenland on 5 July 2007 than does MODIS LST as evidenced by the extensive “blue” area in southern Greenland seen on Figure 3b. Analysis of the LSTs in the blue area indicates that there are large areas where the LSTs are -3°C and -2°C which is close to the LST threshold for melt used in this work (≥-1°C). First, QS has a greater sensitivity for detecting melt as discussed previously. In addition, the skin depth for the LST product is only a few mm while the QS can penetrate through the refrozen snow of the surface layer. Therefore it is likely that the surface was frozen over much of the area and that there was internal liquid water content below the surface layer. Further evidence of this can be drawn from the cases where both MODIS products detected a frozen surface while the QS product detected melt (see, for example, the “blue” area in Figure 4c as discussed previously).

Hoffman et al. (2008) indicate that subsurface melt is often present in a glacial environment. Moreover, van den Broeke et al. (2008) show that radiation penetration can cause the ice to melt below the surface while summer melting can be intermittent due to nighttime surface freezing at higher altitudes (and thus farther inland) of the ice sheet. In Figures 2 to 5, the blue areas (QS melt and MODIS dry snow) are consistently located farther inland at higher latitudes compared to the corresponding red areas (both QS and MODIS melt). This may further explain why melt is detected by QS and not by the MODIS LST.
**Temporal considerations.** Another uncertainty factor is that the LST product may not be acquired at a time of the day when peak melting occurs, while QS senses the meltwater accumulated during the melt process throughout the day between ~06:00 and 18:00 local time. In the days after 5 July 2007, much of the blue area in Figure 3b becomes mostly red, indicating the agreement of both MODIS and QS in the identification of melt extent as melt progresses. But if melt does not progress, the two products will not necessarily agree, that is, if the surface does not melt.

**Limitations of the daily snow albedo product.** Comparisons of the MODIS daily snow albedo product, MOD10A1, with the higher-quality MODIS 16-day albedo product, MCD43C3, are somewhat ambiguous as discussed in Hall et al. (2009), and will require much further work to understand. We found generally good correspondence at the lower elevations of the ice sheet and poorer correspondence at the higher elevations between the MOD10A1 and a daily version of MCD43 (the 16-day MODIS albedo product). The relative MOD10A1 albedo values presented in this paper are reasonable and consistent, though the absolute albedo values may not be accurate as compared to the superior MCD43C3 product which is based on more views of the surface (Schaaf et al., 2002). Absolute values are not required to draw the conclusions reported herein.

**Discussion and Conclusions** Researchers use various remote sensing methods to measure melt on the Greenland Ice Sheet. Each method has advantages and limitations. Algorithms based on active
microwave instruments, such as from a scatterometer, are very sensitive to melt and melt extent, and can detect liquid water beneath the ice sheet surface but cannot provide high spatial resolution and thus great detail, especially in transition areas such as at the snowline. VIS, NIR and IR data provide images of melt at relatively high spatial resolutions (up to 250 m on a daily basis), but cannot image through cloud cover and are not as sensitive to melt as are the microwave sensors. However, when results from these various sensors are combined, or “blended,” then the attributes of each are accentuated and the limitations are downplayed.

Consistent results from the various products provide confirmation of different melting states on the Greenland Ice Sheet for the 2007 melt season. Both the MODIS and QS are sensitive to melt onset. The MODIS daily albedo product is the most sensitive of the three products for detecting surface changes, but the QS is the most sensitive for detecting liquid water in the surface and near-surface of the ice sheet. Surface changes, detected by the MODIS daily snow albedo product, are not necessarily melt-related, but may be related to wind effects.

Relative albedo changes in the MODIS daily snow albedo product show snow and ice surface changes, including surface melt intensity. The MODIS daily snow albedo product responds to grain-size changes between areas with more-intense melting (larger grain sizes) and areas characterized by a frozen surface (smaller grain sizes). Once the grain size has increased due to an earlier melt event, albedo may not regain its highest values after the surface becomes frozen again until new snow is deposited in the region.
by snow drift or snowfall. This explains much of the albedo variability and spatial patterns in refrozen areas.

Elevation and orientation (surface slope azimuth) play an important role in the melt states of the ice sheet. We did not address orientation in this paper, but using DEM (Bamber et al., 2001), we show that elevation change can be associated with sudden changes in the state of melting on the ice sheet by causing rapid changes in near-surface air temperature and thus surface temperature. In addition, large or sudden changes in near-surface air temperatures and thus LST can be caused by katabatic winds.

With this suite of melt products from MODIS and QS, we can measure small changes in the surface- and near-surface melt states of the snow and ice on the Greenland Ice Sheet. The products are consistent in identifying physical properties of the complex snowmelt process. The ice sheet responds very quickly to changes in near-surface temperature through surface melting and re-freezing and even sometimes by maintaining liquid water just beneath the surface (detected by the QS product), yet the amount and depth of liquid water beneath the surface needs to be evaluated further by in-situ observations. Also relevant is a quantitative comparison of the MODIS LST, daily albedo and QS melt maps with melt maps produced using passive-microwave data. This is an important follow-up project for future work, not addressed in the present work.

The products provide remarkably consistent results showing the locations of, and sometimes rapid changes in, boundaries between melted versus frozen surface conditions.
This work has demonstrated that these are physically-meaningful “boundaries” and not artifacts of remote sensing data processing. Using these products, we can improve the precision in mapping surface and near-surface melt on the Greenland Ice Sheet to enable improved quantification of meltwater runoff.

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Figures

Figure 1a & b. Maps developed from blending MODIS land-surface temperature (LST) and QuikSCAT (QS) melt maps from: 1a. 1 June 2007; and 1b. 2 June 2007. Note the melt along the eastern and western margins of the ice sheet.

Figure 2a, b, c & d. 2a. MOD 10A1 albedo map from 3 June 2007 illustrating pronounced reduced albedo in the western margin of the Greenland Ice Sheet corresponding with surface melt; 2b. 3 June 2007 land-surface temperature (LST) – QuikSCAT (QS) blended map; the locations of transects in 2c (east) & d (southwest) are shown as the black lines in Figures 2a & b. The locations shown on the vertical axes represent number of kilometers from the start of the transect; note that the horizontal scale is different in Figures 2c and 2d. The MODIS LST and albedo maps, though acquired on the same day, often show different areas of cloud obscuration because the algorithms to produce each daily product may each select different swaths (from different times of the day) and clouds may thus be in different places. Dashed line is elevation; solid line is albedo.

Figure 3a, b, c & d. 3a. Extensive area of melt in southern Greenland as detected by the MOD10A1 albedo product on 5 July 2007; 3b. MODIS land-surface temperature (LST) – QuikSCAT (QS) blended map from 5 July 2007; 3c. Transect showing albedos and delineation of melt zones from an area in 3c. The locations of transects in Figures 3c & d are shown as the black line in Figures 3a (east) & b (southwest). (White areas in Figure 3d indicate areas where the albedo was <20% or missing.) The MODIS LST and albedo
maps, though acquired on the same day, often show different areas of cloud obscuration because the algorithms to produce each daily product may each select different swaths (from different times of the day) and clouds may thus be in different places. Dashed line is elevation; solid line is albedo.

Figure 4a, b & c. 4a. MOD10 albedo map from 4 August 2007 showing reduced albedo in refrozen snow area of the southern part of the ice sheet; 4b. MODIS land-surface temperature (LST) – QuikSCAT (QS) blended map from 4 August 2007 showing that nearly all of the ice sheet in southern Greenland has refrozen; 4c. Transect in southern Greenland. The location of the transect in Figure 4c is shown as the black line in Figures 4a & b. The MODIS LST and albedo maps, though acquired on the same day, often show different areas of cloud obscuration because the algorithms to produce each daily product may each select different swaths (from different times of the day) and clouds may thus be in different places. Dashed line is elevation; solid line is albedo.

Figure 5a, b & c. 5a. MOD10A1 albedo map from 13 August 2007 showing reduced albedo in refrozen snow area in the southern part of the ice sheet; 5b. MODIS land-surface temperature (LST) – QuikSCAT (QS) blended map from 13 August 2007 showing active melt in southern Greenland; 5c. The location of the transect across the ice sheet is shown in Figures 5a & b. The MODIS LST and albedo maps, though acquired on the same day, often show different areas of cloud obscuration because the algorithms
to produce each daily product may each select different swaths (from different times of
the day) and clouds may thus be in different places. Dashed line is elevation; solid line is
albedo.

Figure 6. MOD10A1 albedo plots from 12 and 13 August 2007 showing lowering of
albedo from 12 to 13 August where extensive melt on 13 August has caused the albedo to
decrease due to grain size increases.

Figure 7a & b. 7a. Minimum albedo on a per-pixel basis as determined from the MODIS
daily snow albedo product, MOD10A1. 7b. Total extent of seasonal snow melt from the
MODIS land-surface temperature (LST) and QuikSCAT (QS) melt maps.
3 June 2007