

Cloud forcing of surface energy balance from *in-situ* measurements in diverse mountain glacier environments

Jonathan P. Conway¹, Jakob Abermann^{2,3}, Liss M. Andreassen⁴, Mohd Farooq Azam⁵, Nicolas J. Cullen⁶,
Noel Fitzpatrick^{7#}, Rianne H. Giesen^{8*}, Kirsty Langley³, Shelley MacDonell^{9,10}, Thomas Mölg¹¹,
5 Valentina Radic⁷, Carleen H. Reijmer⁸, Jean-Emmanuel Sicart¹².

1 National Institute of Water and Atmospheric Research, Lauder, New Zealand

2 Department of Geography and Regional Science, University of Graz, Graz, Austria

3 Asiaq – Greenland Survey, 3900 Nuuk, Greenland

10 4 Section for Glaciers, Ice and Snow, Norwegian Water Resources and Energy Directorate (NVE), Oslo, Norway

5 Department of Civil Engineering, Indian Institute of Technology Indore, India-453552

6 School of Geography, University of Otago, Dunedin, New Zealand

7 Earth, Ocean, and Atmospheric Sciences, University of British Columbia, Vancouver, BC, Canada

8 Institute for Marine and Atmospheric research Utrecht (IMAU), Utrecht University, Utrecht, The Netherlands

15 9 Centro de Estudios Avanzados en Zonas Áridas (CEAZA), Raúl Bitrán 1305, La Serena, Chile

10 Waterways Centre for Freshwater Management, University of Canterbury and Lincoln University, Christchurch, New Zealand

11 Climate System Research Group, Institute of Geography, University Erlangen-Nürnberg (FAU), Germany

20 12 Univ. Grenoble Alpes, CNRS, IRD, Grenoble-INP, Institut des Géosciences de l'Environnement (IGE, UMR 5001), F-38000 Grenoble, France

* now at Royal Netherlands Meteorological Institute (KNMI), De Bilt, The Netherlands

now at Climate Services and Research Applications Division, Met Éireann, Dublin, Ireland

Correspondence to: Jonathan P. Conway (jono.conway@niwa.co.nz)

25 **Abstract.** Clouds are an important component of the climate system, yet our understanding of how they directly and indirectly affect glacier melt in different climates is incomplete. Here we analyse high-quality datasets from 16 mountain glaciers in diverse climates around the globe to better understand how relationships between clouds and near-surface meteorology, radiation, and surface energy balance vary. The seasonal cycle of cloud frequency varies markedly between mountain glacier sites. During the main melt season at each site, an increase in cloud cover is associated with increased vapour pressure and
30 relative humidity but relationships to wind speed are site-specific. At colder sites (average near-surface air temperature in melt season < 0 °C), air temperature generally increases with increasing cloudiness, while for warmer sites (average near-surface air temperature in melt season >> 0 °C) air temperature decreases with increasing cloudiness. At all sites, surface melt is more frequent in cloudy compared to clear-sky conditions. The proportion of melt from temperature-dependent energy fluxes (incoming longwave radiation, turbulent sensible and latent heat) also universally increases in cloudy conditions. However,
35 cloud cover does not affect daily total melt in a universal way, with some sites showing increased melt energy during cloudy

conditions and others decreased melt energy. The complex association of clouds with melt energy is not amenable to simple relationships due to many interacting physical processes (direct radiative forcing, surface albedo, co-variance with temperature, humidity, and wind) but is most closely related to the effect of clouds on net radiation. These results motivate the use of physics-based surface energy balance models for representing glacier-climate relationships in regional- and global-scale assessments of glacier response to climate change.

1 Introduction

Mountain glaciers are sensitive and important components of the climate system. Over the last 50 years, mountain glacier melt has contributed 36-40% of the observed global sea level rise (Hock et al., 2009; Church et al., 2011; Mernild et al., 2014; Zemp et al., 2019; Hugonnet et al., 2021). During the rest of the 21st century, a large but uncertain fraction of the remaining mass stored in mountain glaciers is expected to melt (Radić et al., 2014; Kraaijenbrink et al., 2017; Marzeion et al., 2018; Huss and Hock, 2018; Zekollari et al., 2019). As glaciers are sensitive to change in their surrounding climate, they can be used to infer past changes in climate over decadal (e.g. Mackintosh et al., 2017), centennial (e.g. Oerlemans, 2005; Mölg et al., 2009b) and paleo-climatic timescales (e.g. Putnam et al., 2012).

Our ability to determine how mountain glacier melt responds to changes in climate depends on the ability of models to correctly represent the processes that occur at the atmosphere-glacier interface and link near-surface meteorology and surface melt. The surface energy balance (SEB) is the key process that controls the rate of melt at the glacier surface and can be represented as:

$$Q_M = SW_{net} + LW_{net} + Q_S + Q_L + Q_C + Q_{PRC} \quad 1$$

where Q_M is the energy available for melt (zero when surface is freezing), SW_{net} and LW_{net} are the net fluxes of short and long-wave radiation (including shortwave radiation that penetrates the surface), Q_S and Q_L are the turbulent fluxes of sensible and latent heat, Q_C is the heat flux at the surface from conduction within the glacier and Q_{PRC} is the heat advected from precipitation. All fluxes are given in (W m^{-2}) and those on the righthand side of Equation 1 are defined as positive towards the surface. When the surface is at the melting point (i.e. surface temperature (T_s) = 0 °C), Q_M becomes non-zero and positive, and surface melt (M , mm water equivalent) is determined through:

$$M = Q_M * \Delta t / L_f \quad 2$$

where Δt is the timestep of model output (seconds) and L_f is the latent heat of fusion ($3.34 \times 10^5 \text{ J kg}^{-1}$). In many studies, these relationships between near-surface meteorology and melt are simplified into parameterisations that require less input data such

as temperature index or enhanced temperature index melt models (Huybrechts and Oerlemans, 1990; Hock, 2003; Pellicciotti et al., 2005)

70 While we know that glaciers are sensitive to changes in local climate, the extent to which cloud cover will amplify or reduce
the melting of a glacier in response to future atmospheric warming is uncertain. Clouds alter the incoming shortwave (*SWin*)
and longwave (*LWin*) radiation, which are generally the largest sources of energy at the glacier surface (Sicart et al., 2008;
Pellicciotti et al., 2011; Van Den Broeke et al., 2011; Cullen and Conway, 2015). Over highly reflective glacier surfaces
(e.g. clean snow), a ‘radiation paradox’ can occur, where net radiation (*Rnet*) increases during cloudy conditions (Ambach,
75 1974). Clouds can also enhance or dampen the influence of near-surface meteorology, albedo feedbacks and subsurface
processes (e.g. refreezing) on SEB and melt (Giesen et al., 2008; Giesen et al., 2014; Conway and Cullen, 2016; Van Tricht et
al., 2016; Mandal et al., 2022). As a result, clouds have been associated with both increased and decreased melt rate depending
on the climate (Van Den Broeke et al., 2011; Conway and Cullen, 2016; Chen et al., 2021). In the maritime Southern Alps of
New Zealand, cloudy conditions have been shown to increase the sensitivity of melt to changes in air temperature (Conway
and Cullen, 2016), due to: (i) more frequent melt in cloudy compared to clear-sky conditions, (ii) increased (positive) *LWnet*
80 and Q_L in cloudy conditions that enable a similar daily melt rate as clear-sky conditions, and (iii) a change in precipitation
phase (from snow to rain) that enhances a positive snowdepth - albedo feedback. The higher sensitivity in cloudy conditions
implies that, in the Southern Alps, the response of glacier melt (as well as accumulation) to past and future atmospheric
warming will be modulated by atmospheric moisture (in the form of vapour/cloud/precipitation). How these processes interact
85 in different mountain glacier environments and climate regimes has not been well established.

One challenge has been the lack of direct measurements of cloud amount or type (from e.g. human observer, all-sky camera,
or ceilometer) in mountain areas, which has required the derivation of cloud metrics from surface radiation measurements.
Studies have employed a variety of methods to derive cloudiness from surface radiation measurements, which limits the ability
90 to directly compare results from studies in different regions (Giesen et al., 2008; Conway and Cullen, 2016; Sicart et al., 2016;
Chen et al., 2021).

The key question of this paper is, therefore: how does cloudiness and its relationships with near-surface meteorology, radiation,
and energy balance vary in different mountain glacier environments? The objective is to use a common framework to assess
95 these relationships at a diverse set of sites where high-quality observations and modelling are available. To guide the analyses,
a set of questions was posed:

- i. How often do different cloud conditions occur at each site?
- ii. What is the direct effect of clouds on surface radiation at each site?
- iii. How does near-surface meteorology vary with cloudiness?
- 100 iv. How do the characteristics of melt (e.g. frequency, amount and source of energy) vary in different cloud conditions?

Section 2 sets out the methods used to collate and analyse data sets from 16 glacier automatic weather station (AWS) sites, including the calculation of cloudiness from $LWin$, the definition of melting periods and melt season, and analysis of cloud effects. Section 3 presents results that address the four questions posed above. Section 4 discusses commonalities and differences in cloud – meteorology – SEB – melt relationships, uncertainties and implications for glacier melt modelling.

2 Methods

2.1 Sites and dataset requirements

Datasets of near-surface meteorology and glacier SEB were collated from a diverse set of sites where high-quality observations and modelling were available. The sites were required to have a published SEB record calculated from AWS data collected over a glacier surface during melt seasons at hourly or smaller timestep. The AWS data needed to include measurements of all four components of the radiation balance, incoming ($SWin$) and outgoing shortwave ($SWout$), incoming ($LWin$) and outgoing longwave ($LWout$), all in $W m^{-2}$. In addition, turbulent fluxes were to be calculated using bulk aerodynamic methods avoiding potentially inaccurate assumptions (e.g. surface temperature fixed at $0\text{ }^{\circ}C$ regardless of SEB). Note that published values of surface melt and SEB fluxes are used in these analyses rather than being recalculated from near-surface meteorology and radiation. Thus, differences in the methods used to calculate SEB may introduce some uncertainty (mainly in the calculation of sub-surface fluxes), but the values are congruent with previous studies, and no additional validation is needed. A call for datasets was made on *Cryolist* in January 2020, and data from over 30 sites was offered. After assessing each dataset against the criteria above, 16 sites were selected for analysis (Figure 1 and Table 1). These sites covered many of the mountain glacier regions including continental North America, the European Alps, Norway, Greenland, the Himalaya, tropical glaciers in Africa and the Andes, the arid region of central Chile and the Southern Alps of New Zealand. It is worth noting that no suitable datasets were made available from some large regions of mountain glaciers including Alaska, Patagonia and Asia outside of the Himalaya.

As most AWS sites are in ablation areas, they follow a broad pattern of decreasing altitude with distance from the equator (Figure 2). Note that two locations have observations in both the ablation and accumulation area - Conrad Glacier (CABL, CACC) and Mera Summit (MERA) / Naulek (NAUL, an ablation area of Mera Glacier). Records from the same site in different years were also joined into continuous records (CABL and NAUL). Records from CABL, CACC and NORD cover only summer periods and CHHO has three two-month periods throughout the year, otherwise the records span all months of the year and range from 46 to 3231 days in length (See Table 1 for site name abbreviations). Figures A1 and A2 show monthly average meteorology and SEB fluxes for each site used in the analysis. A few broad groupings of sites (listed in Table 1) can be identified through seasonal trends in near-surface air-temperature (T_a ; $^{\circ}C$) or relative humidity (RH) in Figure A1: mid- and high- latitude maritime and continental sites with strong seasonal cycles of T_a but small variations in RH ; Himalayan sites with

strong cycles of T_a , and distinct wet and dry seasons; tropical sites with small variations in T_a and distinct wet and dry seasons; and a mid-latitude arid site (GUAN) with low RH .

135



Figure 1: Map showing location of study sites with short names (See Table 1 for full names) along with glacier areas from the Randolph Glacier inventory (black outlines; RGI Consortium, 2017). Note the two Conrad Glacier sites (CABL, CACC) are shown as CONR and the two Mera Glacier sites (MERA, NAUL) as MERA. The background map is Natural Earth shaded relief.

140

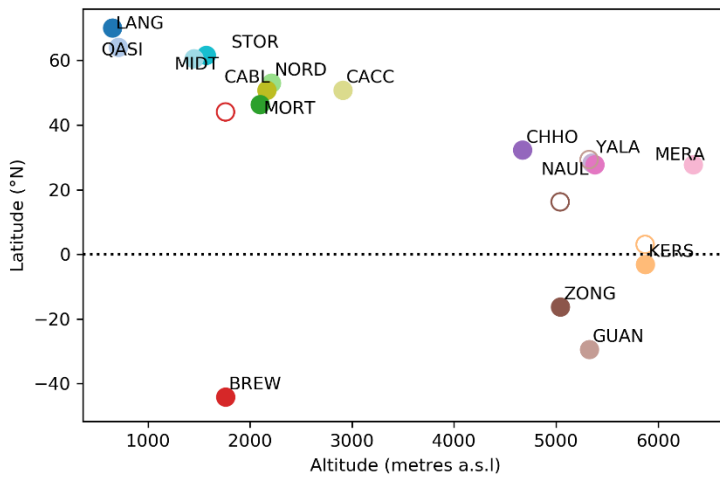


Figure 2: Altitude and latitude of study sites. Open circles show the position of southern hemisphere sites against northern hemisphere sites for comparison.

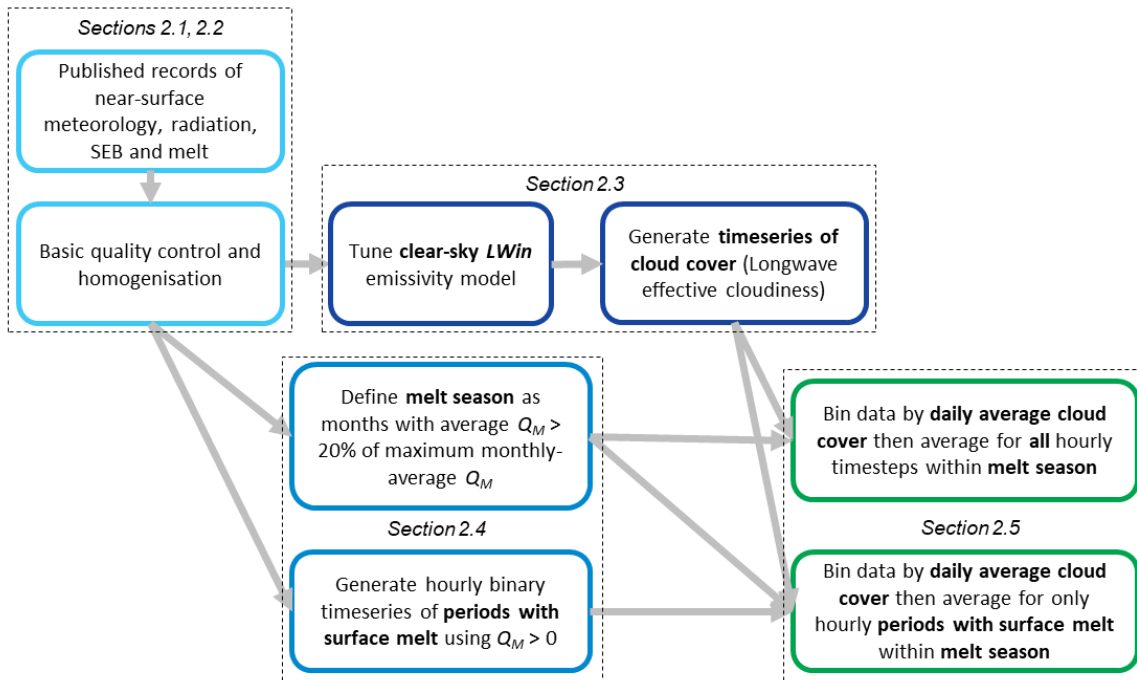
145

Table 1: Details of study sites listed by latitude

Name	Short name	Latitude (°N)	Longitude (°E)	Altitude (m)	Regional climate grouping	Record length (days)	Years of record	Reference
Langfjordjøkelen	LANG	70.133	21.75	650	High-lat. maritime	1070	2007-10	Giesen et al. (2014)
Qasigiannuit	QASI	64.162	-51.359	710	Mid-lat. maritime	703	2014-16	Abermann et al. (2019)
Storbreen	STOR	61.583	8.166	1570	Mid-lat. maritime	1827	2001-06	Andreassen et al. (2008); Giesen et al. (2009)
Midtdalsbreen	MIDT	60.567	7.467	1450	Mid-lat. maritime	2137	2000-06	Giesen et al. (2008); Giesen et al. (2009)
Nordic	NORD	53.051	-120.444	2208	Mid-lat. continental	46	2014	Fitzpatrick et al. (2017)
Conrad (ablation)	CABL	50.823	-116.920	2164	Mid-lat. continental	119	2015-16	Fitzpatrick et al. (2019)
Conrad (accum)	CACC	50.782	-116.912	2909	Mid-lat. continental	68	2016	Fitzpatrick et al. (2019)
Morteratsch	MORT	46.422	9.9318	2100	Mid-lat. continental	3231	1998-2007	Oerlemans et al. (2009)
Chhota Shigri	CHHO	32.28	77.58	4670	Himalaya Monsoon-arid transition	177	2012-13	Azam et al. (2014)
Yala	YALA	28.235	85.618	5350	Himalaya Monsoonal	811	2014-18	Litt et al. (2019)
Mera Summit	MERA	27.706	86.874	6342	Himalaya Monsoonal	867	2013-16	Litt et al. (2019)
Naulek (Mera)	NAUL	27.718	86.897	5380	Himalaya Monsoonal	1387	2013-17	Litt et al. (2019)
Kersten	KERS	-3.078	37.354	5873	Tropical	1078	2005-08	Mölg et al. (2009b)
Zongo	ZONG	-16.25	-68.167	5040	Tropical	362	1999-2000	Sicart et al. (2005)
Guanaco	GUAN	-29.34	-70.01	5324	Mid-lat. arid	910	2008-11	MacDonell et al. (2013)
Brewster	BREW	-44.08	169.43	1760	Mid-lat. maritime	676	2010-12	Conway and Cullen (2016); Cullen et al. (2016)

2.2 Data processing

150 Data from each site were taken through several processing steps as outlined in Figure 3. After basic quality control and homogenisation (described below), a timeseries of cloudiness was generated for each site (Section 2.3), melting periods and the main melt season were defined (Section 2.4), after which cloud effects on melt were analysed (Section 2.5).



155 **Figure 3: Steps used to process and analyse data, annotated with relevant sections of the methods.**

Basic quality control and homogenisation involved the following steps:

- Sub-hourly data resampled to hourly time steps
- Times converted to local solar time using longitude rounded to nearest full hour offset from UTC.
- 160 - Data cut to full days only (no days with partial missing data)
- Naming, units and sign conventions of variables standardised
- Periods with missing radiation data ($SWin$, $SWout$, $LWin$, $LWout$) removed
- Periods with missing T_a and RH data removed.
- Negative values of $SWin$ and $SWout$ set to 0
- 165 - Values of $LWout > 315.6 \text{ W m}^{-2}$ reset to 315.6 W m^{-2}
- Net radiation ($Rnet$) calculated from corrected values of ($SWin$, $SWout$, $LWin$, $LWout$)

- Near-surface vapour pressure (e_a , hPa) calculated from T_a and RH using Buck (1981)
 - Surface temperature (T_s ; °C), if not provided, calculated from $LWout$ using the Stefan-Boltzmann law and a surface emissivity of 1
- 170
- Daily average albedo calculated as ratio of daily sums of $SWin$ and $SWout$
 - If Q_M or surface melt calculated from SEB model is not provided, then Q_M is calculated as positive values of SEB when $T_s > -0.1$ °C. The slightly relaxed constraint on T_s allows for some uncertainty in measured T_s .

Monthly statistics (averages, frequencies by bin etc.) were only calculated when at least 10 days of data from a given month were available.

175 2.3 Defining clear-sky and cloudy periods using incoming longwave radiation

For each site, timeseries of cloudiness were derived from measured $LWin$, e_a and near-surface air temperature ($T_{a,K}$; K) following Konzelmann et al. (1994) and Conway et al. (2015). First, the effective sky emissivity (ϵ_{eff}) was calculated using:

$$\epsilon_{eff} = LWin / \sigma T_{a,K}^4 \quad 3$$

180

where σ is the Stefan–Boltzmann constant (5.67×10^8). While $LWin$ is influenced by emission from surrounding terrain, the sky-view factor at all sites is close to 1 and horizons at all sites are below the limit of the sensor field of view, so no corrections were needed here.

185 Timeseries of theoretical clear-sky emissivity (ϵ_{cs}) at each site were defined using the Brutsaert (1975) curve as modified by Konzelmann et al. (1994) with the exponent set to 1/7 after Dürr et al. (2006):

$$\epsilon_{cs} = \epsilon_{ad} + b(100 \times e_a / T_{a,K})^{(1/7)} \quad 4$$

190 where ϵ_{ad} is an elevation-dependent dry air emissivity term (varying between 0.18 and 0.23) defined here using ϵ_{ad} values determined from radiative transfer modelling in Dürr et al. (2006) for the European Alps that are regressed against elevation (z ; m above sea level):

$$\epsilon_{ad} = 0.2351 - z \times 9.636 \times 10^{-6} \quad 5$$

195

For each site, Equation 4 was fitted to the lowest 10% of $LWin$ in each of 30 $e_a/T_{a,K}$ bins (Figure A3) by finding the value of b (in 0.001 steps) that gave the smallest root mean square error (RMSE). This step used only hours with valid $LWin$, e_a and $T_{a,K}$ values and $RH < 80\%$. Optimised values of b and RMSE are given in Table A1.

200 Timeseries of longwave equivalent cloudiness (N_ϵ) were then derived by fitting hourly measured ϵ_{eff} between theoretical clear-sky (ϵ_{cs}) and overcast ($\epsilon_{ov}=1$) emissivity values, limiting N_ϵ to a range 0 to 1 (Conway et al., 2015):

$$N_\epsilon = (\epsilon_{eff} - \epsilon_{cs}) / (\epsilon_{ov} - \epsilon_{cs}); \quad 6$$

$$N_\epsilon[N_\epsilon > 1] = 1; N_\epsilon[N_\epsilon < 0] = 0$$

205

Following Giesen et al. (2008), clear-sky conditions are defined as $N_\epsilon \leq 0.2$, partial-cloud as $0.2 < N_\epsilon < 0.8$ and overcast as $N_\epsilon \geq 0.8$. Daily average, rather than hourly average, N_ϵ was used to define cloudiness to reduce noise, limit the influence of diurnal cycles in variables and focus on synoptic scale (daily) variability in cloud – SEB relationships. Note that moderate values of daily average cloudiness can indicate either patchy cloud cover and/or a mix of overcast and clear-sky conditions during a day. Cloudiness can be derived from *SWin* (e.g. Greuell et al., 1997; Sicart et al., 2006; Mölg et al., 2009a; Kuipers Munneke et al., 2011) but was considered a less appropriate metric here as its calculation relies on setting a typical cloud extinction coefficient that differs between sites (Pellicciotti et al., 2011). In addition, cloudiness cannot be derived from *SWin* during the night and terrain shading of *SWin* introduces further uncertainty, especially in winter..

210

2.4 Definition of melt season and periods with surface melt

215 For each site, a melt season was defined as the months in which monthly-average Q_M at the site was greater than 20% of the maximum monthly-average Q_M for the same site (Figure A2; A4). This proved a simple method to retain months with substantial melt but exclude winter months where melt is infrequent. The sensitivity of this choice was assessed by replicating key results using only months with monthly-average Q_M greater than 80% of the maximum monthly-average Q_M for that site. Rather than only selecting individual melt events for analysis, averages over all timesteps in the melt season were used to better understand the relationships between cloudiness, surface radiation and near-surface meteorology, without skewing the data towards melt episodes that may have atypical meteorology. To identify the times surface melt occurred and to quantify the contributions of SEB components to Q_M , periods with surface melt were defined as hourly timesteps with $Q_M > 0$.

220

2.5 Analysis of cloud effects

225 The relationship between cloudiness, meteorology, SEB and melt is assessed by binning the timeseries of different variables by daily average cloudiness. Five evenly sized bins were used with bin centres at $N_\epsilon = 0.1, 0.3, 0.5, 0.7$ and 0.9 , with the top and bottom bins corresponding to clear-sky and overcast conditions, respectively. Data within each bin were then averaged across all days within the main melt season to demonstrate the average relationships between cloudiness and different variables.

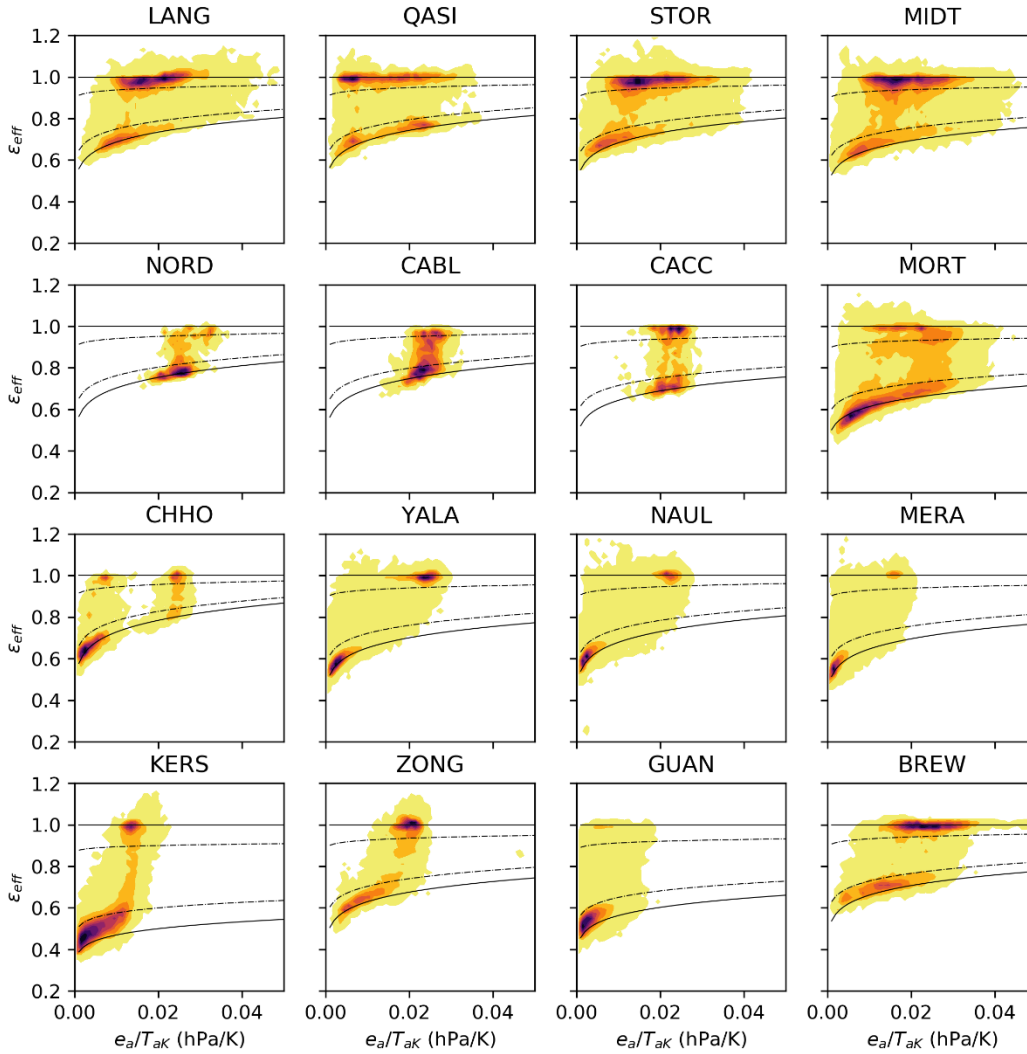
230 In sections 3.2, 3.3 and 3.4, we use the term cloud effects to describe the change in a variable during cloudy conditions with respect to clear-sky conditions. In studies of net radiation, the cloud effect (CE) is defined as the difference between average and clear-sky conditions (e.g. Ambach, 1973; van den Broeke et al., 2008). Here we extend the concept to Q_M in order to describe the average change in melt related to clouds, even though clouds are not the only meteorological forcing responsible for changes in Q_M . We calculate CE for all net radiation components (SW_{net} , LW_{net} , R_{net}) and Q_M . Here, we calculate CE by
235 subtracting the average value in the clear-sky bin ($N_\varepsilon \leq 0.2$) from the average value equally weighted across all cloudiness bins. Equally weighting each cloudiness bin ensures that differences in the frequency of different cloud conditions do not skew the data between sites.

3 Results

3.1 Cloud metrics

240 3.1.1 Effective sky emissivity and fitted clear-sky curve

The derivation of clear-sky emissivity from $LWin$ highlighted substantial variations in the relationship between near-surface meteorology and $LWin$ between the sites. On an hourly basis, most sites show a preference for either clear-sky or overcast conditions, as shown by the darker colours around the clear-sky and overcast emissivity (Figure 4). Sites in the Himalaya (CHHO, YALA, NAUL, MERA) showed a distinct seasonality with predominately warm/wet/overcast or cold/dry/clear-sky
245 conditions. Tropical and arid glacier sites (KERS, GUAN) show a much lower ε_{cs} for the same surface vapour pressure, in part due to the high elevation (therefore low ε_{ad}), but also due to the low value of b (Equation 4; Table A1), which indicates a thinner atmospheric water vapour profile above the surface compared to Himalayan sites at similar altitudes. Mid-latitude sites with records covering the full annual cycle in Europe (LANG, MIDT, MORT, STOR) and New Zealand (BREW) show a similar preference for cold/dry/clear-sky or warm/wet/overcast conditions, while QASI shows a greater frequency of cloud at
250 lower temperature/vapour pressure. Sites in the Western Cordillera of Canada (NORD, CABL, CACC) and Europe (MIDT, MORT, STOR) show more frequent partial cloud than many other sites. Note that the short summertime records from Canada (NORD, CABL, CACC) do not capture the full spectrum of conditions at these sites.



255 **Figure 4: Frequency of observed ϵ_{eff} (filled contours) versus $e_a/T_{a,K}$ for sites arranged by latitude. Also shown are calculated ϵ_{cs} (lower solid line), ϵ_{ov} (upper solid line) and ϵ_{eff} at clear-sky and overcast limits of $N_\epsilon = 0.2$ and $N_\epsilon = 0.8$, respectively (lower and upper dashed lines, respectively). Contours of relative frequency created from 2D histogram with common x and y bins across all sites with colours in 10 steps between 1 (yellow) and the maximum number of hours in any x, y bin for each site (dark brown/black).**

260 3.1.2. Monthly cloud frequency

The frequency of clear-sky, partial-cloud and overcast conditions also shows distinct regional and seasonal variations (Figure 5 for daily average, Figure A4 for hourly periods). Mid-latitude glaciers in maritime locations show very limited seasonality (BREW, STOR, MIDT) and a high percentage of overcast conditions, except for LANG that displays more frequent overcast conditions during the melt season and QASI that shows a tendency towards more frequent clear-sky conditions during its melt

265 season. Mid-latitude sites in continental locations (NORD, CABL, CACC, MORT) show less frequent overcast and more
frequent partial-cloud conditions than the mid-latitude maritime sites, with MORT showing more frequent partial-cloud
conditions during the melt season and more frequent clear-sky conditions in the winter. Most Himalayan sites (YALA, MERA,
NAUL) show much stronger seasonality, with more frequent overcast conditions during the melt season. The exception is
270 CHHO, which shows weaker monsoon influence (fewer overcast conditions) being on the transition zone between monsoon
and arid regions (Azam et al., 2021), though the fraction of partial-cloud conditions still increases in July and August. While
ZONG experiences melt most of the year, melt rates are higher during the cloudier months from September through April
corresponding with marked seasonal changes in cloud and SEB caused by the tropical climate (Figure A2). KERS experiences
less cloud from June through October, with low melt rates year-round. GUAN experiences the least cloud, with predominately
clear-sky conditions and only sporadic melt during austral summer.

275

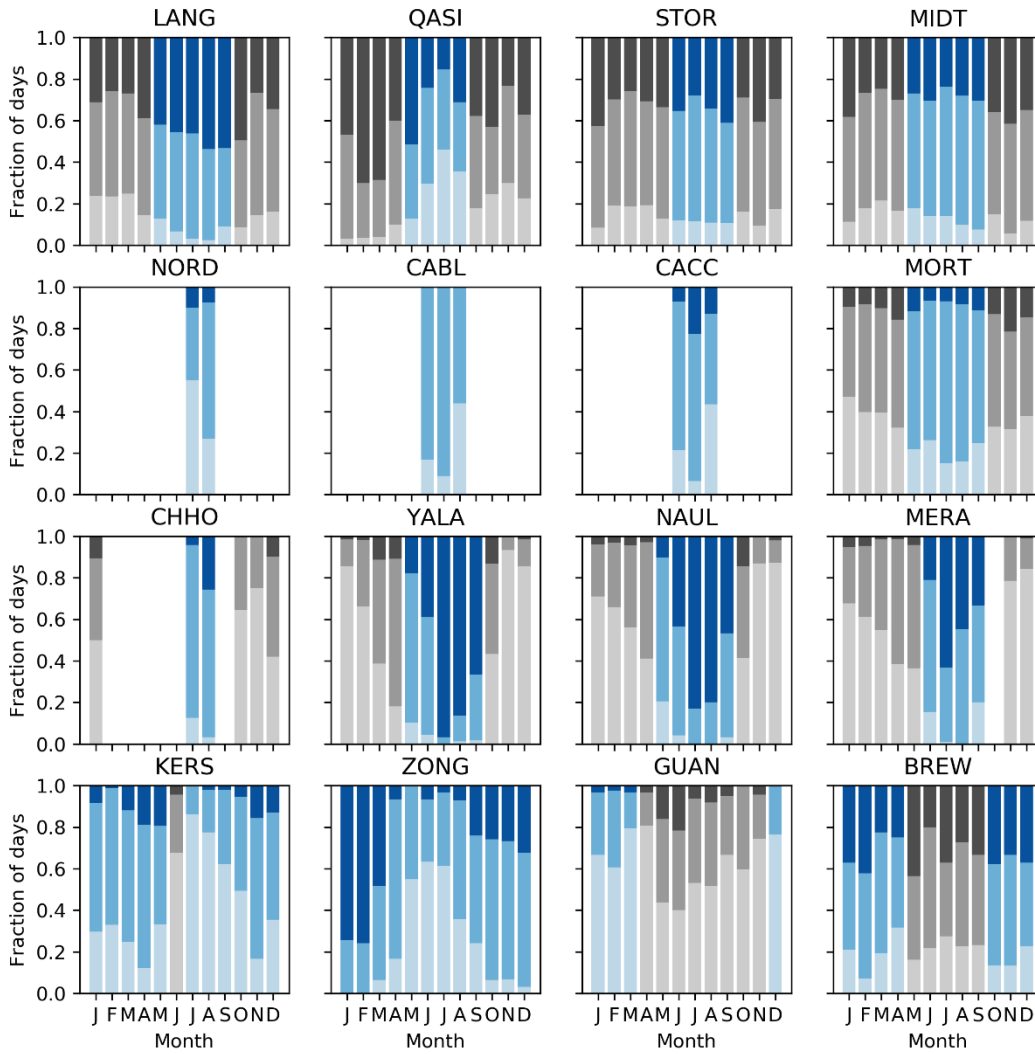


Figure 5: Monthly fraction of clear-sky (light shading), partial-cloud (mid shading) and overcast conditions (dark shading) defined using daily average cloudiness (N_e). Months defined as within the ‘melt season’ are shaded blue.

280 3.2 Cloud effects on melt-season surface radiation

An estimate of the direct effect of clouds on the SEB is gained by examining the variation of incoming radiation ($SWin$ and $LWin$) with cloudiness (Figure 6). At most sites the average direct effect of clouds on incoming radiation is negative, steadily decreasing with increasing cloud cover to between -60 and -170 W m^{-2} (Figure 6f). The exceptions are low-latitude and high-altitude sites KERS, MERA, and ZONG, where comparatively small decreases in $SWin$ with cloudiness (Figure 6d) are compensated by large increases in $LWin$ (Figure 6e). The large variation in $SWin$ and $LWin$ cloud effects between sites suggests

285

that different cloud types and cloud properties play a role in determining radiative forcing and this should be investigated in future work. We note that changes in the profile of water vapour and air temperature (estimated by e_a and T_a) also influence $LWin$ (and to a much lesser extent $SWin$). Hence, the direct cloud effects shown here represent the combined effects of direct radiative forcing and changes to atmospheric profiles of water vapour and temperature, in contrast to analyses of cloud radiative forcing that consider the changes in incoming radiation with respect to calculated clear-sky values (e.g. Sicart et al., 2016).

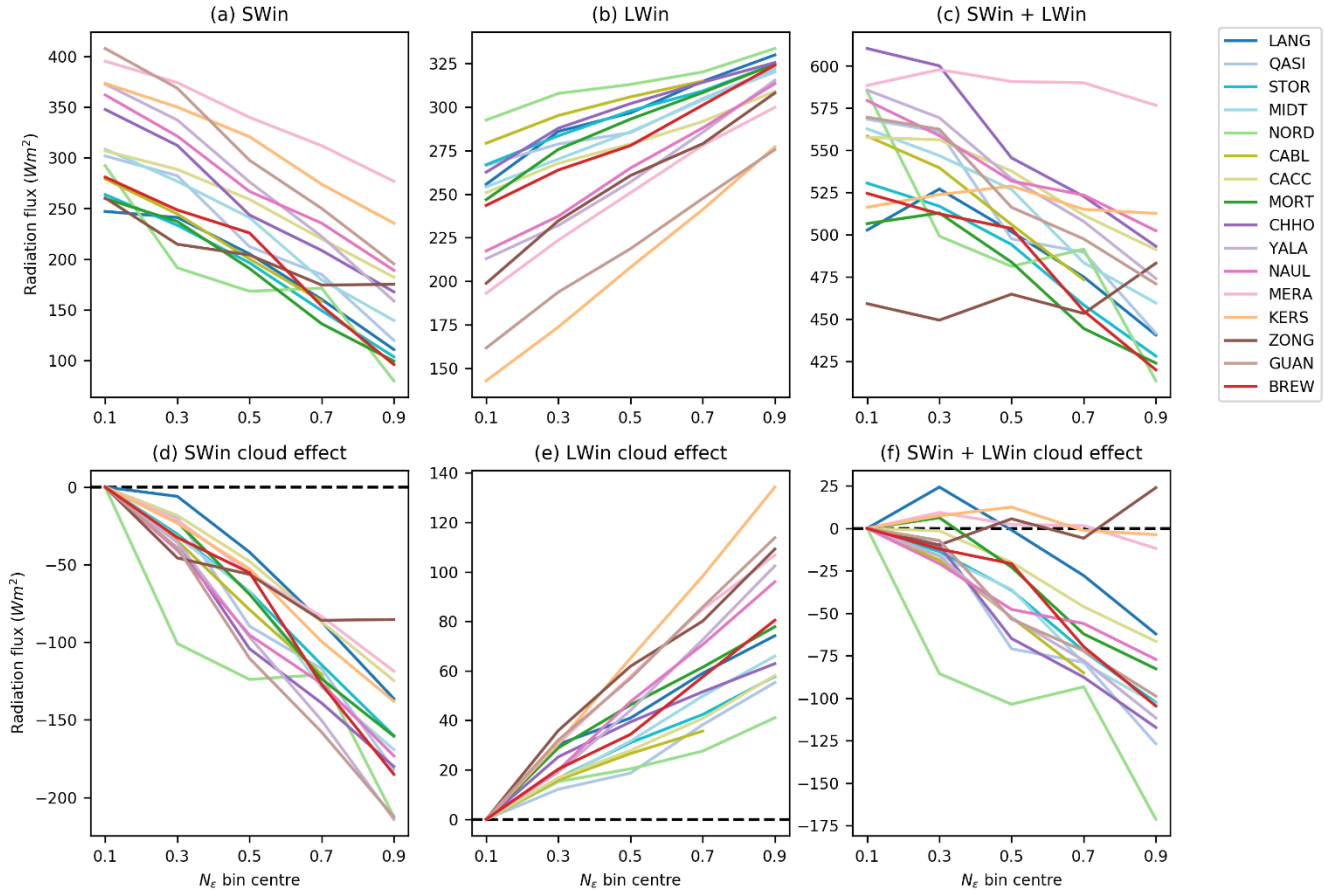


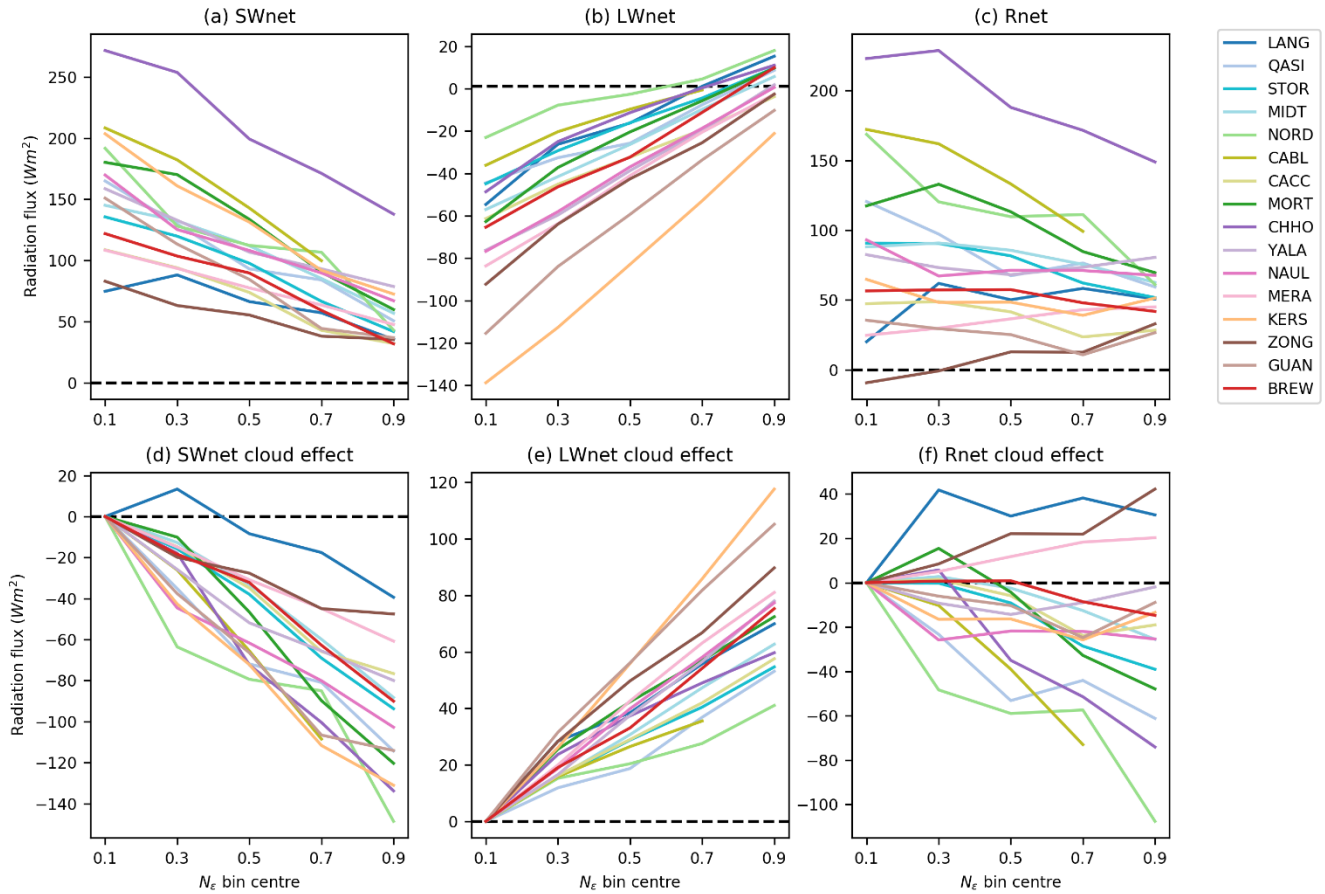
Figure 6: (a)-(c) Average melt-season incoming radiation fluxes ($SWin$, $LWin$) for different daily average cloud conditions (N_e), (d)-(f) as for (a)-(c) expressed as change from clear-sky conditions ($N_e \leq 0.2$). Note y-axis range differs between panels.

295

By analysing the change in net radiation fluxes (SW_{net} , LW_{net} and R_{net}) the effect of albedo and surface temperature is included with the direct effect of clouds on incoming radiation (Figure 7). A clear increase in R_{net} during cloudy periods (positive R_{net} cloud effect), aka ‘radiation paradox’, is observed at some sites: ZONG, MERA, LANG (Figure 7f), due to small negative SW_{net} effect and strong positive LW_{net} effect (Figure 7d,e). GUAN and KERS have a similarly strong positive LW_{net} effect at higher values of N_e , but much more negative SW_{net} effects cancel these out. For most sites, the R_{net} cloud

300

effect is small and negative (0 to -20 W m^{-2}). Many of these sites show a decrease in R_{net} only at higher values of N_c , while 3 sites (MIDT, MORT, CHHO) show the highest R_{net} in partial-cloud conditions, emphasising that the relationship between R_{net} and cloudiness is not always linear. $NORD$, $CABL$, $QASI$, and $CHHO$ all show a strong negative R_{net} cloud effect, driven by strong negative SW_{net} effect and weak LW_{net} cloud effect. For the two sites with measurements from both the accumulation and the ablation areas, accumulation sites exhibit more positive and/or less negative R_{net} cloud effect compared with their ablation area counterparts, driven by the change in SW_{net} cloud effect (surface albedo) rather than a large change in LW_{net} cloud effect.



310 **Figure 7:** (a)-(c) Average melt-season net radiation fluxes (SW_{net} , LW_{net} , R_{net}) for different daily average cloud conditions (N_c), (d)-(f) as for (a)-(c) expressed as change from clear-sky conditions ($N_c \leq 0.2$). Note y-axis range differs between panels.

3.3 Variation of near-surface meteorology with cloudiness

Alongside radiative changes, differences in near-surface meteorology are also an important driver of SEB and melt variations with cloudiness, particularly Q_S , Q_L and $LWin$. Air temperature shows a divergent relationship to cloudiness; at sites with average melt-season $T_a \gg 0$ °C, increasing cloudiness is associated with lower temperatures, while at sites with average melt-season $T_a < 0$ °C (KERS, MERA, NAUL, YALA), cloudiness is generally associated with higher temperatures (Figure 8a). Average T_a varies little with cloud cover at ZONG and CHHO. At most sites, wind speed decreases with increasing cloudiness (Figure 8b). The exceptions are BREW and STOR, which show moderate increases ($< 1 \text{ m s}^{-1}$), LANG and MIDT, which show larger increases (1.6 and 2.9 m s^{-1} , respectively), QASI, which shows no large change cloudiness and CACC, which shows peak wind speed at moderate cloudiness. Sites where wind speed increases with cloudiness (particularly MIDT and LANG) have a wind climate that is mainly influenced by the large-scale circulation, while other sites may have a more local wind climate where local or meso-scale katabatic or convective circulations prevail (e.g. Mölg et al., 2020; Conway et al., 2021). Stronger radiative cooling during clear-sky periods may promote higher katabatic wind speeds in clear-sky conditions, though the relationship is not simple; at ZONG, strong winds during clear-sky conditions are related to large-scale forcing during the dry season (Litt et al., 2014). As expected, e_a and RH increase with cloudiness, however some sites with e_a around the saturation vapour pressure of melting surface show a weak relationship to cloudiness (e.g. QASI, CACC). The wide variation of RH in clear-sky conditions (~ 30 to $\sim 70\%$) implies that care should be taken when using RH to model cloud cover using empirical parameterisations developed for particular study areas, or even at different altitudes (e.g. NAUL vs MERA).

330

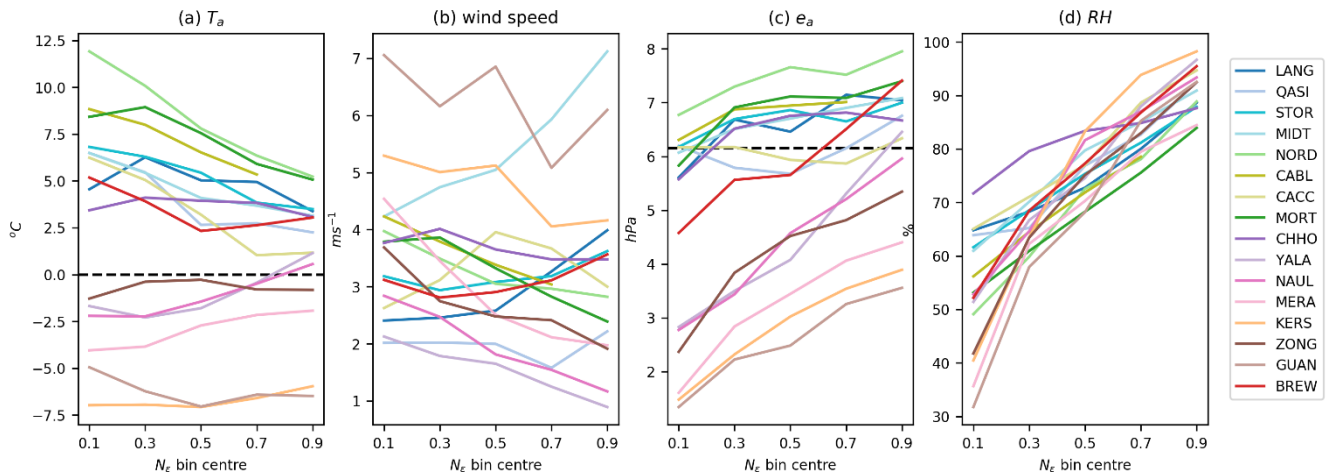
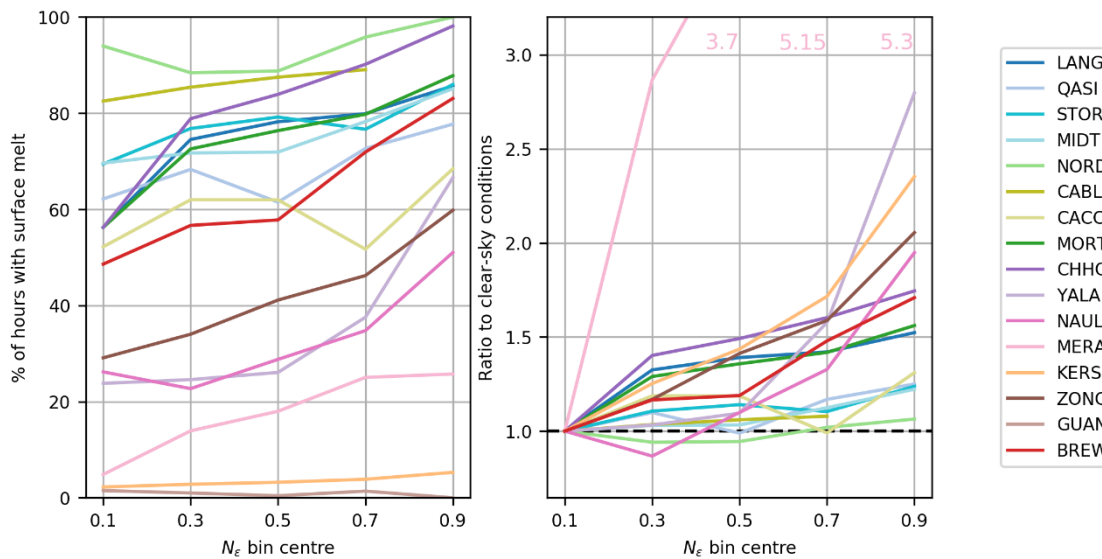


Figure 8: Average melt-season near-surface meteorology for different daily average cloud conditions (N_e). Dashed lines indicate melting point temperature in (a) and saturation vapour pressure in (c).

335 3.4 Variation of melt frequency, melt amount and SEB with cloudiness

The percentage of hours with surface melt increases with cloudiness at all study sites (Figure 9), with the exception of GUAN, which experiences very infrequent melt in all conditions. Colder sites across the Himalaya and tropical regions (except KERS) show the largest increases with respect to clear-sky conditions (up to 5 times more frequent), while BREW, MORT and LANG all show moderate increases up to 1.5 times more frequent in overcast conditions. Other European and North American sites show comparatively high melt frequency across all cloud conditions, indicative of the warm conditions where e_a exceeds that of a melting ice/snow surface. Even in these conditions, periods with surface melt still become more common with increasing cloudiness, with 100% of overcast periods at NORD experiencing melt (Figure 9a). While analysis of diurnal patterns of melt is beyond the scope of this paper, the higher percentage of hours with melt during overcast conditions indicates that night time melt is more frequent during overcast periods. . MERA shows the largest increase in melt frequency with cloudiness, with melt 5 times more frequent in overcast (26% of overcast conditions) compared to clear-sky conditions (5%). A consistent increase with cloudiness is observed at MERA but caution is warranted given the small number of hours with melt in clear-sky conditions (20 hours).



350 **Figure 9: (a) Percentage of hours with surface melt for different cloud conditions (N_e) during melt season, (b) as for (a) shown as fraction with respect to clear-sky conditions ($N_e \leq 0.2$). Note GUAN is excluded from panel (b) due to insufficient datapoints and for clarity some points for MERA are shown as text within the panel.**

In contrast to the percentage of hours with surface melt, the relationship between the amount of energy available for melt (Q_M) and cloudiness does not show a universal variation, with sites showing increased, decreased or no change with increasing

cloudiness on average (Figure 10). Around half the sites show a general reduction of daily average Q_M with increasing cloudiness, particularly those in North America (CABL, CACC, NORD) and some European sites (MIDT, MORT, STOR) along with QASI and CHHO. LANG, MERA and KERS show large relative increase in Q_M with cloudiness, while BREW, ZONG and YALA show a more mixed response with a small increase in melt in overcast conditions. LANG and NAUL display a sharp change from clear-sky conditions to the first partial cloud bin ($N_e \sim 0.3$), but little change with increasing cloudiness.

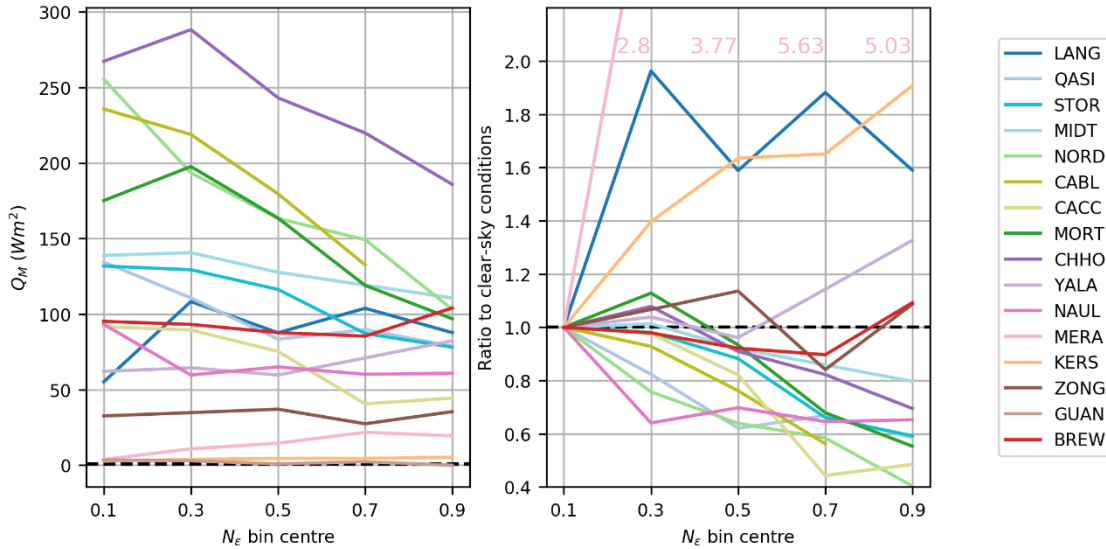


Figure 10: (a) Average melt-season Q_M for different cloud conditions (N_e) (b) as for (a) shown as fraction with respect to clear-sky conditions ($N_e \leq 0.2$). Note GUAN is excluded from panel (b) due to insufficient datapoints and for clarity some points for MERA are shown as text within the panel.

365

As cloudiness increases, the source of Q_M changes; at all sites, the contribution of $SWnet$ reduces and a greater proportion of Q_M comes from the temperature-dependent fluxes ($LWnet$, Q_S and Q_L) (Figure 11a,f; see Figure A5 for absolute values). At almost all sites, $LWnet$ changes sign with cloudiness, from an energy sink in clear sky to an energy source in overcast conditions. At colder and drier sites (KERS, MERA, GUAN, NAUL, YALA, ZONG), negative Q_L reduces Q_M during clear-sky periods, but this effect reduces towards 0 as cloudiness increases. At the coldest sites (KERS, MERA and ZONG), Q_L remains negative during melt (indicating evaporation as $T_s = 0$ °C) even in overcast conditions. At BREW and CHHO, Q_L switches sign with cloudiness, from an energy sink during clear-sky condition to an energy source in overcast conditions, while other mid and high latitude sites show modest increases in Q_L with cloudiness. Small Q_S fluxes at MERA, NAUL, YALA, ZONG are due to T_a values during melt remaining around 0 °C. At other sites, the proportion of melt from Q_S remains fairly static with cloudiness, despite decreasing in absolute magnitude (Figure A5) due to decreases in T_a (Figure 8a). The exceptions are BREW, MIDT, and QASI where the contribution from Q_S increases with cloudiness and ZONG where the contribution of

375

Q_S decreases. Note that as Figure 11 presents averages for only periods with surface melt, LW_{out} is constant and changes in LW_{net} are entirely due to LW_{in} .

380

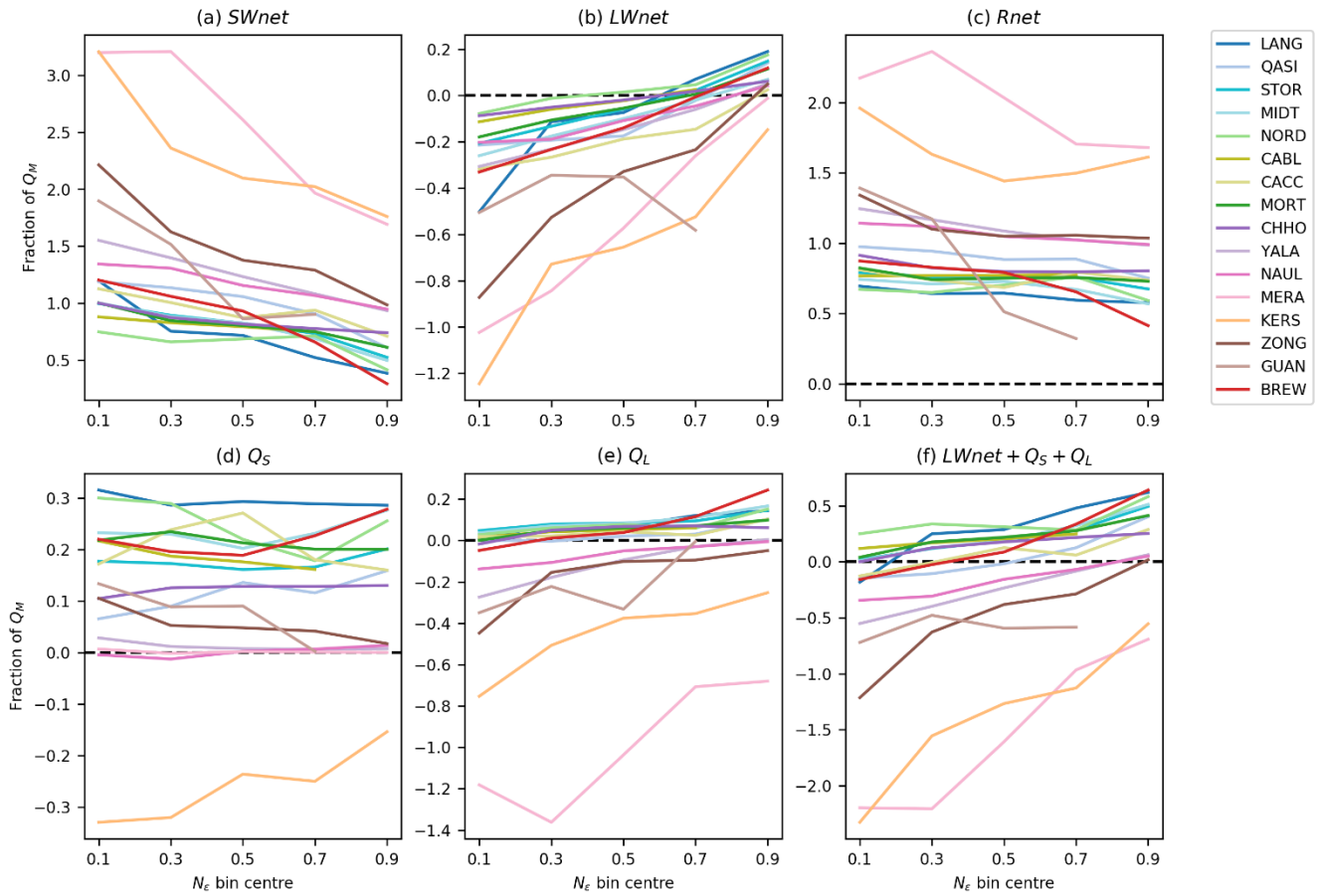


Figure 11: Average melt-season SEB terms during hours with surface melt for different cloud conditions (N_c). Variables are shown as a fraction of average Q_M during hours with surface melt in each respective cloud condition (N_c). Note y-axis range differs between panels.

385

3.5 Relationships between Q_M cloud effect and site characteristics

While the average change in Q_M with cloudiness is small at some sites, it is instructive to assess whether the melt-season average Q_M cloud effect (CE) at the various sites can be related to geographic or climatic parameters. Figure 12a,b shows the relationship between average cloudiness and melt at the various sites does not directly relate to latitude or altitude. Average near-surface air temperature is moderately correlated to Q_M CE (Figure 12c). Sites with lower T_a (e.g. MERA, KERS) generally

390

have smaller Q_M CE than sites with higher high T_a (NORD, CABL, MORT), but with some notable exceptions (e.g. LANG has positive Q_M CE with relatively high T_a). Average cloudiness shows some association to Q_M CE with clearer sites tending to have more negative Q_M CE (Figure 12e), with the exception of tropical/arid sites with predominately clear-skies (KERS, GUAN) that show neutral Q_M CE. Neither, average wind speed or relative humidity show a clear relationships with the Q_M CE (Figure 12d,f). Average turbulent heat fluxes and $LWin$ are moderately correlated Q_M CE (Figure 12g,h,j), largely following the pattern of sites shown for T_a , while average $SWin$ is not significantly correlated (Figure 12i).

Considering the association of radiative and melt cloud effects, average incoming radiation cloud effects explain some of the variance of Q_M CE, with $LWin$ (Figure 12l) showing a stronger association than $SWin$ CE (Figure 12k). Combined, the incoming radiation cloud effects can explain over half (53%) of the variation in Q_M CE (Figure 12m). Surface albedo has a similar correlation to Q_M CE (Figure 12n) as the incoming radiation cloud effects together. The combination of these into the $Rnet$ CE shows the clearest relationship to Q_M CE (Figure 12o). In general, sites that experience a radiation paradox (LANG, ZONG, MERA) also experience greater melt in cloudy conditions (positive Q_M CE), while sites with negative $Rnet$ CE experience less melt in cloudy conditions (Figure 12o).

Turbulent flux cloud effects are also moderately correlated to melt-season average Q_M CE (Figure 12p,q) and when combined explain approximately 44% of the variance in Q_M CE (Figure 12r). Thus, sites where Q_S decreases with cloudiness show more negative Q_M CE. Sites where Q_S varies little with cloudiness and/or Q_L becomes less negative/more positive during cloudy periods show neutral or positive Q_M CE. Interestingly, the radiative and turbulent heat cloud effects show a moderate association, with sites with large negative $Rnet$ CE also having a negative net turbulent flux cloud effect, and vice versa (Figure 12s).

410

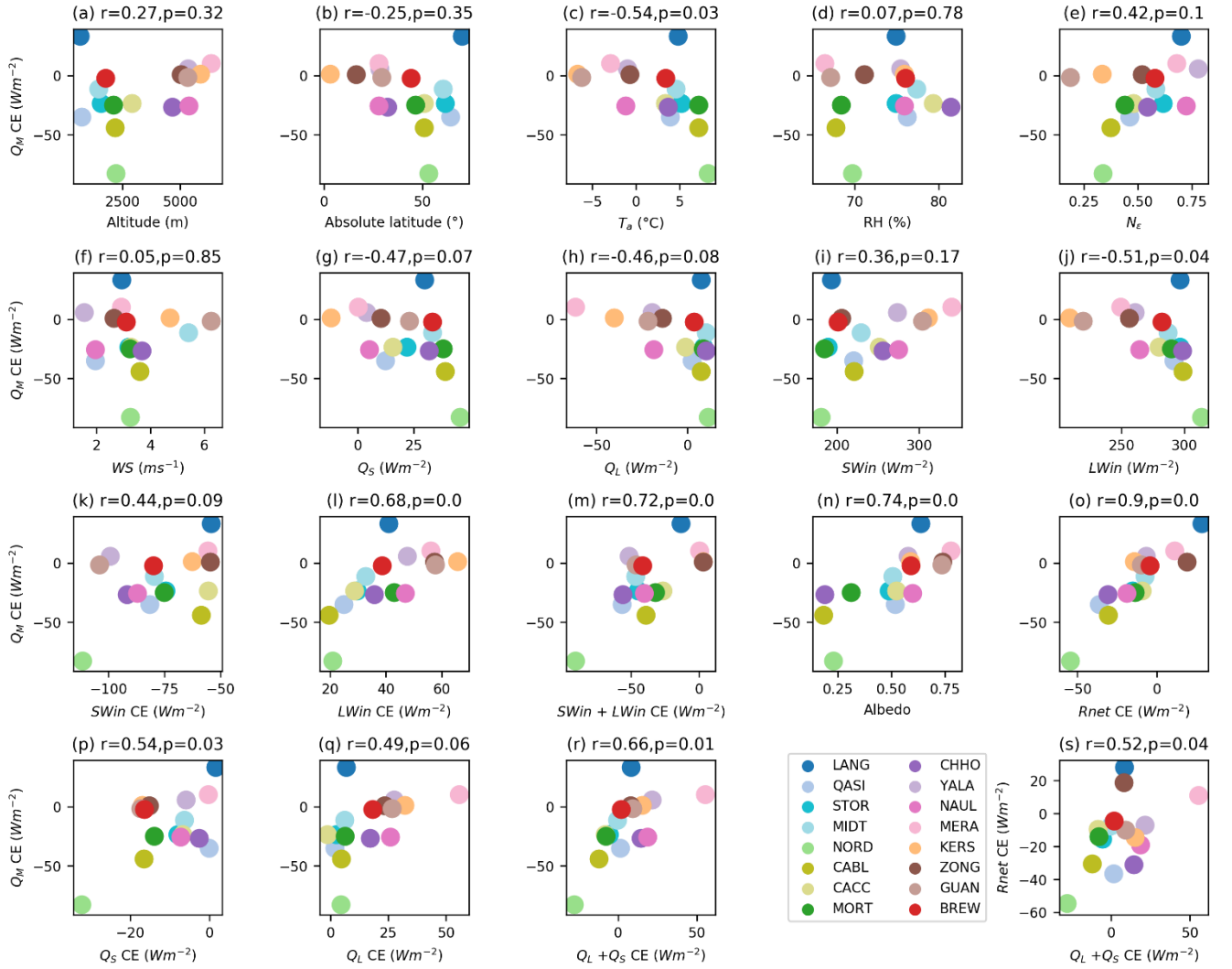


Figure 12: The variation of average melt-season Q_M cloud effect (CE) with (a) station altitude, (b) absolute station latitude, average melt-season (c) T_a , (d) RH, (e) N_{ϵ} , (f) wind speed (WS), (g) Q_S , (h) Q_L , (i) $SWin$, (j) $LWin$, (k) $SWin$ CE, (l) $LWin$ CE, (m) $SWin+LWin$ CE, (n) albedo, (o) $Rnet$ CE, (p) Q_S CE, (q) Q_L CE, (r) $Q_S + Q_L$ CE. (s) is variation of $Rnet$ CE with $Q_S + Q_L$ CE. See Section 2.5 for definition of CE. Average melt-season values are calculated by averaging values from the 5 cloudiness bins equally.

4 Discussion

4.1 Regional and elevational patterns

420 Two groups of sites with a broadly similar response emerge from the above analyses, largely split by latitude, but also air
temperature and continentality. The first group (YALA, NAUL, MERA, KERS, ZONG) consists of high-altitude sites in
tropical regions and the Himalaya (excluding CHHO). These sites are comparatively cold, with negative Q_L and small Q_S
during melt (Figure A5d,e). During cloudy conditions, these sites experience warmer and calmer conditions (Figure 8a,b),
reduced evaporation/sublimation (less negative or, at times, positive Q_L ; Figure A5e) and a large increase in the fraction of
425 time that melt occurs (Figure 9), regardless of the seasonality of cloud or the typical cloud conditions (e.g. KERS vs MERA).
These sites also generally experience greater Q_M in cloudy periods (except for NAUL; Figure 10) when averaged over a long
melt season that includes months with marginal melt conditions. Some sites experience a radiation paradox where R_{net}
increases with cloudiness, while others show a small decrease in R_{net} with cloudiness (Figure 7f). While GUAN experiences
similar patterns of near-surface meteorology and radiation as the sites in this group, it experiences very infrequent melt (Figure
430 9a).

The second group consists of the mid- and high-latitude sites outside the Himalaya (LANG, QASI, STOR, MIDT, NORD,
CABL, CACC, MORT, BREW) as well as CHHO. These sites experience higher average melt-season T_a , and T_a generally
decreases with cloudiness (Figure 8a). Despite decreased T_a , melt becomes more frequency in cloudy conditions (Figure 9).
435 With a few exceptions (e.g. BREW, LANG), Q_M decreases with increased cloudiness, though the magnitude of decrease varies
widely (from 20% to 60% less in overcast compared to clear-sky conditions; Figure 10). CHHO stands out from the other
Himalayan sites in that it has a higher average T_a that does not vary greatly with cloudiness (Figure 8a). Here also, low albedo
drives a strong negative R_{net} cloud effect (Figure 7f) that, in turn, drives a large decrease in Q_M during cloudy periods (Figure
10). At all these sites, Q_S is positive in all cloud conditions (Figure 11d), though the absolute magnitude is generally reduced
440 in cloudy periods due to decreased T_a (Figure A5d). Cloud is associated with increased wind speed at most maritime sites
(LANG, MIDT, STOR, BREW; Figure 8b) but does not show a consistent relationship to Q_M (Figure 10); MIDT and STOR
experience less Q_M in cloud conditions, whereas LANG and BREW experience greater Q_M due to increased wind speed and
comparatively modest decreases in T_a that drive increased LW_{net} and more positive Q_L (Figure A5e). In the case of LANG,
increased Q_M during cloud is also due to a positive R_{net} cloud effect (Figure 7f).

445 Locations with AWS at two elevations highlight more positive R_{net} cloud effects at accumulation sites than ablation sites due
to the higher albedo (Figure A1) and larger difference between clear-sky and overcast emissivity (Figure 4). Differences in
melt are stronger at the Himalayan pair (NAUL, MERA), where melt is decreased in cloudy conditions at the lower sites and

increased during cloud at the upper site (Figure 10). At the pair in Canada (CABL, CACC), both sites experience reduced melt
450 during cloudy conditions, though in absolute terms, the decrease is larger in the ablation area.

4.2 Limitations

The derivation of cloudiness from $LWin$ also poses challenges. At some sites (e.g. LANG, and MORT), ε_{cs} shows a poor fit at
higher vapour pressure, with incoming $LWin$ during clear-sky periods being higher than that expected from the theoretical
455 curves (Figure 4). This mismatch between theoretical and observed ε_{cs} during periods of higher e_a may cause some clear-sky
periods to be misclassified as being in the first partial cloud bin ($N_\varepsilon \sim 0.3$). Indeed, at both LANG and MORT, the $N_\varepsilon \sim 0.3$ bin
shows higher melt, indicating this may be the case. The reasons for this mismatch have not been investigated, but it may be
due to a different method used to correct $LWin$ data (Giesen et al, 2014) or changes in water vapour profiles in the atmospheric
boundary layer. There is also some unavoidable degree of circularity in analysing longwave radiation fluxes (Figures 6 and 7)
460 that have also been used to derive cloudiness. However, as $LWin$ does not solely depend on cloudiness, but also on variations
in T_a and RH , the circularity is not complete. For instance, at Brewster Glacier, the increase in $LWin$ between clear-sky and
overcast conditions is approximately the same as the change in clear-sky $LWin$ due to seasonal variations in T_a . Because the
method used to calculate cloudiness accounts for the effect of T_a and RH on $LWin$, the effect of these variations in near-surface
meteorology on $LWin$ is retained in the analyses shown in Figures 6 and 7.

465

While efforts have been made to homogenise the datasets, it is possible that biases still affect the results. Interannual variability
causes uncertainty, particularly for sites with only one or two seasons (e.g. NORD, ZONG). Giesen et al. (2008 Table 4) show
that at MIDT, the contribution of SEB components to melt during clear-sky periods can vary up to 12% between years, while
variability in overcast periods is less. The interannual variability is partly influenced by the seasonality of anomalies in
cloudiness, with strong anomalies in spring causing the importance of Q_S to melt to change markedly. Some sites also have
470 discontinuous records (CABL, CACC, NORD, CHHO) that do not include periods with lower melt rate outside the peak melt
season. Increased clear-sky solar radiation and T_a as well as decreased albedo during the peak melt season are likely to cause
 $Rnet$ and Q_M cloud effects to be larger at these sites compared to those with longer records that include periods of more marginal
melt. This effect is demonstrated by repeating the analysis but restricting the melt season to months with at least 80% of the
maximum monthly-average Q_M , 2-3 months at each site (Figure A6). Figure 13 shows the relationship between average Q_M
475 and N_ε for the period with peak melt rates at each site. The previously large increase in Q_M with cloud at MERA and LANG
becomes more variable, and Q_M is smaller in overcast conditions compared to clear-sky. This is primarily due to the removal
of months with a high albedo snow surface in the early season where a strong radiation paradox drives an increase in melt
during cloud periods. In clear-sky conditions, higher T_a and e_a in the peak melt season creates generally positive Q_L at these
480 sites (not shown). BREW also now shows a moderate decrease in Q_M with cloud, while ZONG shows a much stronger decrease
due to marked seasonal changes in the SEB terms driving melt (less negative $LWnet$ and Q_L in austral spring and summer;

Figure A2). Only one site (YALA) still shows its highest Q_M in overcast conditions, but the increase is small compared to the average for the longer melt season. In fact, at outer-tropical sites such as ZONG where melt can occur in most months alongside large seasonal variations in precipitation and cloudiness, the analysis here likely mixes cloud effects with seasonal changes of other meteorological forcings (such as potential solar irradiance, humidity and air temperature).

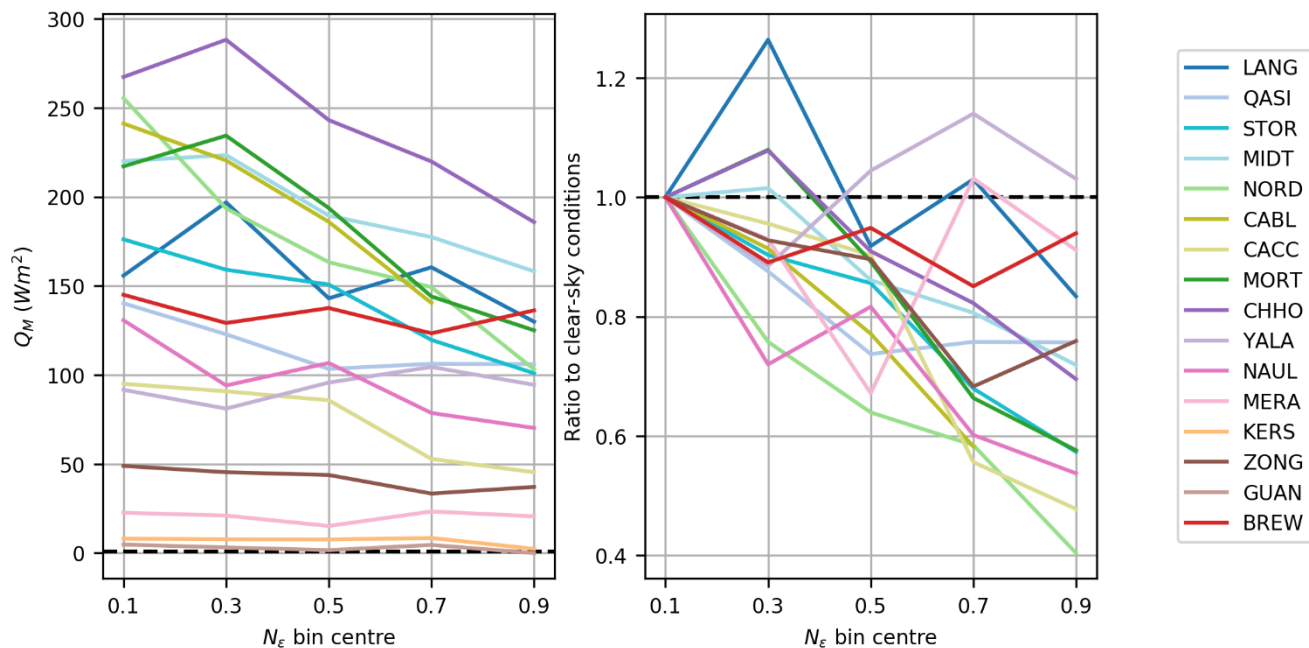


Figure 13: As for Figure 10 but only for months with > 80% of maximum monthly-average Q_M . Note GUAN and KERS are excluded from panel (b) due to insufficient datapoints.

490

Seasonal changes in cloud effects on melt have been previously reported by some studies; Giesen et al. (2008) show that negative Q_M cloud effects at MIDT were restricted to July and August, with other months showing neutral or positive cloud effects; Conway and Cullen (2016) show only one month with negative Q_M cloud effect at BREW, with positive effects in other months; Chen et al. (2021) report strong negative Q_M cloud effects in July and August for Laohugou Glacier No. 12 in the western Qilian Mountains of China, with weaker negative effects in May and June, and neutral effects in September. To elucidate spatial patterns of net melt cloud effect, future studies should investigate seasonal patterns of cloud effects, and establish the timing of transitions between periods of positive and negative Q_M CE and how these relate to R_{net} CE and surface meteorology. It is likely that the timing of transition from positive to negative Q_M CE will therefore determine the melt-season average cloud effects. To this end, there is a need to capture AWS records through the full annual cycle at study sites in order to fully understand the relationships between meteorological forcing and melt.

500

4.3 Mechanisms influencing SEB changes with cloud

In addition to the key role that surface albedo plays in determining R_{net} , there are three key mechanisms that drive temporal changes in SEB with cloudiness

- 505 i) direct forcing of incoming radiation (decreased SW_{in} and increased LW_{in}),
- ii) changes to near-surface meteorology that alter turbulent heat fluxes
- iii) surface and subsurface temperature feedbacks that alter net radiative and turbulent fluxes

Here we demonstrate that direct forcing of incoming radiation and surface albedo explains much of the net effect of clouds on Q_M across sites. The high correlation between melt-season average R_{net} CE and Q_M CE between sites (Figure 12), along with the sensitivity of these averages to the length of the melt season (Figure 10 vs Figure 12) underlines the primary control of direct and indirect radiative mechanisms on determining the sign of melt response to cloud. It is likely that substantial seasonal variations of R_{net} CE exert the primary control on the effect of clouds on glacier melt.

515 Changes in turbulent heat fluxes with cloudiness tend to be smaller in magnitude than changes in R_{net} (Figure A5), except for the more extreme cases where air temperature changes greatly with cloudiness, e.g. NORD, where Q_S markedly decreases with cloud and MERA, where Q_L becomes far less negative during cloud. Despite this, net turbulent heat flux cloud effects show moderate correlation to Q_M CE, and thus changes in near-surface meteorology play a significant role in determining the net response of melt to cloud. These findings echo those of Liu et al. (2021) who show increased melting during cloudy periods on Mt Everest are due to increased R_{net} as well as lower wind speeds that drive smaller losses to Q_L , and Conway et al. (2016) who found changes to Q_L contributed to increased melt during cloudy periods. Future work should assess the mechanisms driving the observed covariance between cloudiness and near-surface meteorology at different sites, e.g. Do large-scale changes in air mass or local/meso-scale processes drive changes in T_a with cloud? How well are these processes represented in the datasets used to force glacier melt models on regional scales? Seasonal changes in the relative magnitudes of turbulent and radiative cloud effects also deserve further scrutiny.

530 Surface temperature responds quickly to changes in SEB, and here we show that during cloudy periods, a melting state is observed more frequently, in line with previous research on maritime glaciers (Conway et al., 2016). We have not attempted to analyse further surface and sub-surface temperature feedbacks here as not all datasets contain these variables and a detailed analysis is more suited to sensitivity experiments that allow the transient response of sub-surface temperature, humidity and refreezing to be resolved.

The increased frequency of melt during cloudy conditions, especially at higher elevations, raises the question of how glacier-wide melt is altered by clouds, along with how glacier-wide surface mass balance is altered by refreezing. Van Tricht et al.,

535 (2016) show increased runoff from the Greenland Ice Sheet during cloudy periods due to increased melt extent and decreased
refreezing of melt water, while Niwano et al. (2019) found clouds increase melt extent but reduce total melt due to feedbacks
between cloudiness and near-surface humidity. These studies are in line with the findings here – that clouds enhance the
possibility of melt at a given site, by removing large negative LW_{net} and Q_L fluxes to precondition the surface to melt, but do
not necessarily cause greater melt unless albedo is high enough to cause a radiation paradox or unless increased near-surface
540 air temperature, humidity and/or wind speed causes an increase in net turbulent fluxes.

4.4 Implications for glacier melt modelling

Previous research that identified a higher sensitivity to warming associated with cloud at BREW (Conway and Cullen, 2016),
showed this occurred without increased melt during cloud periods. The effect was primarily due to increased melt frequency
and temperature-dependent fluxes during cloudy periods as well as accumulation-albedo feedbacks. All sites analysed here
545 show increased melt frequency and temperature-dependent fluxes during cloudy periods, suggesting more sites may also
experience a higher sensitivity to warming associated with cloud. While a formal analysis is beyond the scope of this paper,
we may therefore expect that the response of melt to past and future temperature change will be modified by changes to
atmospheric moisture in the form of clouds and vapour fluxes. The simplified temperature-index models that are generally
used to predict future glacier change on global and regional levels (e.g. Marzeion et al., 2018; Huss and Hock, 2018; Zekollari
550 et al., 2019) do not account for these effects. Enhanced temperature-index models that can account for changes in cloudiness
through solar radiation (e.g. Pellicciotti et al., 2005) only include the opposite effect – a reduction in solar radiation by clouds
– and therefore may underestimate future melt at sites where cloud cover is not universally associated with reduced melt (e.g.
high altitude and maritime glacier sites). Given the positive effect of clouds on net radiation at snow covered and high-altitude
sites, future increases in cloud cover may promote further melt, especially during marginal melt seasons and especially at high
555 elevations. However, caution is warranted in making generalisations as the analysis here shows that even in this set of 16
glaciers, we find variability in the links between clouds and melt, and it seems that some processes are site specific even in
this small sample.

The non-linear relationships between clouds and melt motivates the use of SEB models in regional and global assessments of
560 glacier response to climate change. To aid in the development of globally and regionally applicable SEB models and parameter
sets, the research community should investigate creating a central open-source repository for glacier AWS and SEB datasets
along with supporting metadata. Such a repository would facilitate the easy transfer of data between researchers, streamline
processing by establishing data format and metadata standards, as well as motivating best-practice in data collection and quality
control. Alongside this, careful assessments of SW_{in} and LW_{in} and their relationship to near-surface meteorology from global,
565 regional and meso-scale meteorological models should be undertaken to ensure uncertainties in model input data are reduced
and to assess the need for downscaling to account for local-scale processes. As many glacier SEB models rely on empirical

relationships between *SWin* and *LWin* to modify these variables to account for local-scale changes in near-surface meteorology (e.g. Mölg et al., 2009a; Conway et al., 2015), globally applicable parameterisations of *SWin* and *LWin* should be tested.

Conclusions

- 570 Sixteen high-quality published datasets of near-surface meteorology, radiation, and surface energy balance over glaciers in very different climate settings have been homogenised and analysed in a common framework. The analyses sought to assess how the relationships between clouds, near-surface meteorology and surface energy balance vary in different mountain glacier environments. Distinct regional differences in the seasonality of cloudiness are demonstrated between different mountain glacier environments. On average, over the main period of melt at each site:
- 575 - Near-surface humidity (both relative and absolute) is shown to universally increase in cloudy conditions. In contrast, a divergent relationship is found between near-surface air temperature and cloudiness; at colder sites (average near-surface air temperature in melt season $< 0\text{ }^{\circ}\text{C}$), air temperature is increased in cloudy conditions, while for warmer sites (average near-surface air temperature in melt season $\gg 0\text{ }^{\circ}\text{C}$), air temperature decreases in cloudy conditions. In essence, air temperature tends towards the melting point of ice in cloudy conditions. Wind speed shows a mixed
- 580 association to cloudiness at different sites.
- Most sites, on average, show a modest to strong decrease in net radiation during cloudy conditions during the melt season. A few sites show a clear increase in net radiation with cloud – aka ‘radiation paradox’ – but this result is sensitive to the months used in the analysis due to seasonal changes in incoming radiation fluxes and albedo.
- At all sites, surface melt is more frequent in cloudy compared to clear-sky conditions.
- 585 - At all sites, temperature-dependent fluxes contribute a larger fraction of melt energy during cloudy conditions, primarily due to increased incoming longwave radiation and less negative and/or more positive turbulent latent heat fluxes. The contribution of turbulent sensible heat generally varies little with cloudiness.
- Cloud cover does not affect daily total melt in a universal way; some sites show average melt energy increases in cloudy conditions while at other sites, average melt energy decreases. The complex association of clouds and melt
- 590 energy is due to the interaction of multiple physical processes (direct radiative forcing, surface albedo, co-variance with temperature, humidity, and wind) that force it to vary widely with latitude, average melt-season air temperature, degree of continentality, season, and elevation. Overall, the association of clouds and melt is most closely related to net radiation cloud effect, with sites displaying a radiation paradox also showing an increase in energy for melt in cloudy conditions.
- 595 - It is likely that substantial seasonal variations in *Rnet* CE exert the primary control on the effect of clouds on glacier melt, through changes in surface albedo and the balance of incoming radiation fluxes. Changes in net turbulent fluxes also play a role, and the mechanisms driving co-variance between clouds and near-surface air temperature, humidity and wind speed should be more widely explored.

600 The non-linear relationships between clouds, near-surface meteorology and melt motivate the use of physics-based surface energy balance models for understanding future glacier response to climate change, particularly in areas where atmospheric moisture plays a key role both in accumulation and ablation processes (e.g. Himalaya, tropical glaciers, maritime glaciers). Future work should also look to carefully assess shortwave and longwave radiation fluxes and their relationships with near-surface meteorology in global, regional and meso-scale meteorological model analyses if we are to confidently use these tools
605 to better understand how future glacier melt will respond to changes in atmospheric temperature.

Data and code availability

AWS data is available from individual paper authors listed in Table 1. Analysis code can be accessed at <https://github.com/jonoconway/cloud-glacier>.

610

Author contributions

JC conceptualized the study, curated the data, conducted the formal analyses, and wrote the manuscript. Other co-authors supplied data suitable for curation, aided in the investigation and reviewed/edited the manuscript.

Acknowledgements

615 JCs contribution to this research was supported by the Royal Society of New Zealand Marsden Fund. The authors wish to thank the following additional people and organisations for data contributions and funding data collection and processing: Maxime Litt, Hans Oerlemans, GLACIOCLIM (UGA-OSUG, CNRS-INSU, IRD, IPEV, INRAE), International Joint Laboratory LMI GREAT-ICE (IRD, EPN-Quito), PROMICE, the Greenland Ecosystem Monitoring Programme, ICIMOD, Antoine Rabatel (IGE), Alvaro Soruco (UMSA, Bolivia), NSERC Discovery Grant and Research Tools and Instruments,
620 Canada Foundation for Innovation. MFA acknowledges research grants from IFCPAR and IRD, France. Patrick Wagon is thanked for his helpful comments on the manuscript. We also thank the editor and two anonymous reviewers for their comments, which have improved the final manuscript.

References

- 625 Abermann, J., Van As, D., Wacker, S., Langley, K., Machguth, H., and Fausto, R. S.: Strong contrast in mass and energy balance between a coastal mountain glacier and the Greenland ice sheet, *Journal of Glaciology*, 65, 263-269, 10.1017/jog.2019.4, 2019.
- Ambach, W.: The influence of cloudiness on the net radiation balance of a snow surface with high albedo, *Journal of Glaciology*, 13, 73-84, 10.3189/S0022143000023388, 1974.

- 630 Andreassen, L. M., Van Den Broeke, M. R., Giesen, R. H., and Oerlemans, J.: A 5 year record of surface energy and mass balance from the ablation zone of Storbreen, Norway, *Journal of Glaciology*, 54, 245-258, 10.3189/002214308784886199, 2008.
- Azam, M. F., Kargel, J. S., Shea, J. M., Nepal, S., Haritashya, U. K., Srivastava, S., Maussion, F., Qazi, N., Chevallier, P., Dimri, A. P., Kulkarni, A. V., Cogley, J. G., and Bahuguna, I.: Glaciohydrology of the Himalaya-Karakoram, *Science*, 373, 10.1126/science.abf3668, 2021.
- 635 Azam, M. F., Wagnon, P., Vincent, C., Ramanathan, A. L., Favier, V., Mandal, A., and Pottakkal, J. G.: Processes governing the mass balance of Chhota Shigri Glacier (western Himalaya, India) assessed by point-scale surface energy balance measurements, *The Cryosphere*, 8, 2195-2217, 10.5194/tc-8-2195-2014, 2014.
- Brutsaert, W.: A Theory for Local Evaporation (or Heat Transfer) From Rough and Smooth Surfaces at Ground, *Water Resources Research*, 11, 543-550, 10.1029/WR011i004p00543, 1975.
- 640 Buck, A. L. A. L.: New Equations for Computing Vapor Pressure and Enhancement Factor, *Journal of Applied Meteorology*, 20, 1527-1532, 10.1175/1520-0450(1981)020<1527:NEFCVP>2.0.CO;2, 1981.
- Chen, J., Du, W., Kang, S., Qin, X., Sun, W., Liu, Y., Jin, Z., Li, Y., and Wang, L.: Eight-year analysis of radiative properties of clouds and its impact on melting on the Laohugou Glacier No. 12, western Qilian Mountains, *Atmospheric Research*, 250, 10.1016/j.atmosres.2020.105410, 2021.
- 645 Church, J. A., White, N. J., Konikow, L. F., Domingues, C. M., Cogley, J. G., Rignot, E., Gregory, J. M., van den Broeke, M. R., Monaghan, A. J., and Velicogna, I.: Revisiting the Earth's sea-level and energy budgets from 1961 to 2008, *Geophysical Research Letters*, 38, L18601, 10.1029/2011gl048794, 2011.
- Conway, J. P. and Cullen, N. J.: Cloud effects on surface energy and mass balance in the ablation area of Brewster Glacier, New Zealand, *The Cryosphere*, 10, 313-328, 10.5194/tc-10-313-2016, 2016.
- 650 Conway, J. P., Cullen, N. J., Spronken-Smith, R. A., and Fitzsimons, S. J.: All-sky radiation over a glacier surface in the Southern Alps of New Zealand: characterizing cloud effects on incoming shortwave, longwave and net radiation, *International Journal of Climatology*, 35, 699-713, 10.1002/joc.4014, 2015.
- Conway, J. P., Helgason, W. D., Pomeroy, J. W., and Sicart, J. E.: Icefield breezes: mesoscale diurnal circulation in the atmospheric boundary layer over an outlet of the Columbia Icefield, Canadian Rockies, *Journal of Geophysical Research: Atmospheres*, 126, e2020JD034225, 10.1029/2020jd034225, 2021.
- 655 Cullen, N. J. and Conway, J. P.: A 22 month record of surface meteorology and energy balance from the ablation zone of Brewster Glacier, New Zealand, *Journal of Glaciology*, 61, 931-946, 10.3189/2015JoG15J004, 2015.
- Cullen, N. J., Anderson, B., Sirguey, P., Stumm, D., Mackintosh, A., Conway, J. P., Horgan, H. J., Dadic, R., Fitzsimons, S. J., and Lorrey, A.: An 11-year record of mass balance of Brewster Glacier, New Zealand, determined using a geostatistical approach, *Journal of Glaciology*, 1-19, 10.1017/jog.2016.128, 2016.
- 660 Fitzpatrick, N., Radić, V., and Menounos, B.: Surface Energy Balance Closure and Turbulent Flux Parameterization on a Mid-Latitude Mountain Glacier, Purcell Mountains, Canada, *Frontiers in Earth Science*, 5, 67, 2017.
- Fitzpatrick, N., Radić, V., and Menounos, B.: A multi-season investigation of glacier surface roughness lengths through in situ and remote observation, *The Cryosphere*, 13, 1051-1071, 10.5194/tc-13-1051-2019, 2019.
- 665 Giesen, R. H., Andreassen, L. M., Oerlemans, J., and Van Den Broeke, M. R.: Surface energy balance in the ablation zone of Langfjordjøkelen, an arctic, maritime glacier in northern Norway, *Journal of Glaciology*, 60, 57-70, 10.3189/2014JoG13J063, 2014.
- Giesen, R. H., Andreassen, L. M., van den Broeke, M. R., and Oerlemans, J.: Comparison of the meteorology and surface energy balance at Storbreen and Midtdalsbreen, two glaciers in southern Norway, *The Cryosphere*, 3, 57-74, 10.5194/tc-3-57-2009, 2009.
- 670

- Giesen, R. H., van den Broeke, M. R., Oerlemans, J., and Andreassen, L. M.: Surface energy balance in the ablation zone of Mittaldalsbreen, a glacier in southern Norway: Interannual variability and the effect of clouds, *Journal of Geophysical Research*, 113, 10.1029/2008jd010390, 2008.
- 675 Greuell, W., Knap, W. H., and Smeets, C. J. P. P.: Elevational changes in meteorological variables along a midlatitude glacier during summer, *Journal of Geophysical Research*, 102, 25941-25954, 1997.
- Hock, R.: Temperature index melt modelling in mountain areas, *Journal of Hydrology*, 282, 104-115, 10.1016/s0022-1694(03)00257-9, 2003.
- Hock, R., de Woul, M., Radić, V., and Dyurgerov, M.: Mountain glaciers and ice caps around Antarctica make a large sea-level rise contribution, *Geophysical Research Letters*, 36, L07501, 10.1029/2008gl037020, 2009.
- 680 Hugonnet, R., McNabb, R., Berthier, E., Menounos, B., Nuth, C., Girod, L., Farinotti, D., Huss, M., Dussailant, I., Brun, F., and Kaab, A.: Accelerated global glacier mass loss in the early twenty-first century, *Nature*, 592, 726-731, 10.1038/s41586-021-03436-z, 2021.
- Huss, M. and Hock, R.: Global-scale hydrological response to future glacier mass loss, *Nature Climate Change*, 8, 135-140, 10.1038/s41558-017-0049-x, 2018.
- 685 Huybrechts, P. and Oerlemans, J.: Response of the Antarctic ice sheet to future greenhouse warming, *Climate Dynamics*, 5, 93-102, 10.1007/BF00207424, 1990.
- Kraaijenbrink, P. D. A., Bierkens, M. F. P., Lutz, A. F., and Immerzeel, W. W.: Impact of a global temperature rise of 1.5 degrees Celsius on Asia's glaciers, *Nature*, 549, 257-260, 10.1038/nature23878, 2017.
- 690 Kuipers Munneke, P., Reijmer, C. H., and van den Broeke, M. R.: Assessing the retrieval of cloud properties from radiation measurements over snow and ice, *International Journal of Climatology*, 31, 756-769, 10.1002/joc.2114, 2011.
- Litt, M., Sicart, J. E., Helgason, W. D., and Wagnon, P.: Turbulence Characteristics in the Atmospheric Surface Layer for Different Wind Regimes over the Tropical Zongo Glacier (Bolivia, 16°S), *Boundary-Layer Meteorology*, 154, 471-495, 10.1007/s10546-014-9975-6, 2014.
- 695 Litt, M., Shea, J., Wagnon, P., Steiner, J., Koch, I., Stigter, E., and Immerzeel, W.: Glacier ablation and temperature indexed melt models in the Nepalese Himalaya, *Sci Rep*, 9, 5264, 10.1038/s41598-019-41657-5, 2019.
- Liu, W., Zhang, D., Qin, X., van den Broeke, M. R., Jiang, Y., Yang, D., and Ding, M.: Monsoon Clouds Control the Summer Surface Energy Balance on East Rongbuk Glacier (6,523 m Above Sea Level), the Northern of Mt. Qomolangma (Everest), *Journal of Geophysical Research: Atmospheres*, 126, 10.1029/2020jd033998, 2021.
- 700 MacDonell, S., Kinnard, C., Mölg, T., Nicholson, L., and Abermann, J.: Meteorological drivers of ablation processes on a cold glacier in the semi-arid Andes of Chile, *The Cryosphere*, 7, 1513-1526, 10.5194/tc-7-1513-2013, 2013.
- Mackintosh, A. N., Anderson, B. M., Lorrey, A. M., Renwick, J. A., Frei, P., and Dean, S. M.: Regional cooling caused recent New Zealand glacier advances in a period of global warming, *Nature Communications*, 8, 14202, 10.1038/ncomms14202, 2017.
- 705 Mandal, A., Angchuk, T., Azam, M. F., Ramanathan, A., Wagnon, P., Soheb, M., and Singh, C.: 11-year record of wintertime snow surface energy balance and sublimation at 4863 m a.s.l. on Chhota Shigri Glacier moraine (western Himalaya, India), *The Cryosphere Discuss.* [preprint], <https://doi.org/10.5194/tc-2021-386>, in review, 2022.
- Marzeion, B., Kaser, G., Maussion, F., and Champollion, N.: Limited influence of climate change mitigation on short-term glacier mass loss, *Nature Climate Change*, 8, 305-308, 10.1038/s41558-018-0093-1, 2018.
- 710 Mernild, S. H., Liston, G. E., and Hiemstra, C. A.: Northern Hemisphere Glacier and Ice Cap Surface Mass Balance and Contribution to Sea Level Rise, *Journal of Climate*, 27, 6051-6073, 10.1175/jcli-d-13-00669.1, 2014.
- Mölg, T., Cullen, N. J., and Kaser, G.: Solar radiation, cloudiness and longwave radiation over low-latitude glaciers: implications for mass-balance modelling, *Journal of Glaciology*, 55, 292-302, 10.3189/002214309788608822, 2009a.

- Mölg, T., Cullen, N. J., Hardy, D. R., Winkler, M., and Kaser, G.: Quantifying Climate Change in the Tropical Midtroposphere over East Africa from Glacier Shrinkage on Kilimanjaro, *Journal of Climate*, 22, 4162-4181, 10.1175/2009jcli2954.1, 2009b.
- 715 Mölg, T., Hardy, D. R., Collier, E., Kropač, E., Schmid, C., Cullen, N. J., Kaser, G., Prinz, R., and Winkler, M.: Mesoscale atmospheric circulation controls of local meteorological elevation gradients on Kersten Glacier near Kilimanjaro summit, *Earth System Dynamics*, 11, 653-672, 10.5194/esd-11-653-2020, 2020.
- Niwano, M., Hashimoto, A., and Aoki, T.: Cloud-driven modulations of Greenland ice sheet surface melt, *Sci Rep*, 9, 10380, 10.1038/s41598-019-46152-5, 2019.
- 720 Oerlemans, J.: Extracting a climate signal from 169 glacier records, *Science*, 308, 675-677, 10.1126/science.1107046, 2005.
- Oerlemans, J., Giesen, R. H., and van den Broeke, M. R.: Retreating alpine glaciers: increased melt rates due to accumulation of dust (Vadret da Morteratsch, Switzerland), *Journal of Glaciology*, 55, 729-736, 10.3189/002214309789470969, 2009.
- Pellicciotti, F., Raschle, T., Huerlimann, T., Carenzo, M., and Burlando, P.: Transmission of solar radiation through clouds on melting glaciers: a comparison of parameterizations and their impact on melt modelling, *Journal of Glaciology*, 57, 367-381, 725 10.3189/002214311796406013, 2011.
- Pellicciotti, F., Brock, B. W., Strasser, U., Burlando, P., Funk, M., and Corripio, J.: An enhanced temperature-index glacier melt model including the shortwave radiation balance: development and testing for Haut Glacier d'Arolla, Switzerland, *Journal of Glaciology*, 51, 573-587, 10.3189/172756505781829124, 2005.
- Putnam, A. E., Schaefer, J. M., Denton, G. H., Barrell, D. J. A., Finkel, R. C., Andersen, B. G., Schwartz, R., Chinn, T. J. H., 730 and Doughty, A. M.: Regional climate control of glaciers in New Zealand and Europe during the pre-industrial Holocene, *Nature Geoscience*, 5, 627-630, 10.1038/ngeo1548, 2012.
- Radić, V., Bliss, A., Beedlow, A. C., Hock, R., Miles, E., and Cogley, J. G.: Regional and global projections of twenty-first century glacier mass changes in response to climate scenarios from global climate models, *Climate Dynamics*, 42, 37-58, 10.1007/s00382-013-1719-7, 2014.
- 735 RGI Consortium: Randolph Glacier Inventory – A Dataset of Global Glacier Outlines: Version 6.0: Technical Report, Global Land Ice Measurements from Space, Colorado, USA. Digital Media. DOI: 10.7265/N5-RGI-60, 2017.
- Sicart, J. E., Hock, R., and Six, D.: Glacier melt, air temperature, and energy balance in different climates: The Bolivian Tropics, the French Alps, and northern Sweden, *Journal of Geophysical Research*, 113, 10.1029/2008jd010406, 2008.
- Sicart, J. E., Wagnon, P., and Ribstein, P.: Atmospheric controls of the heat balance of Zongo Glacier (16°S, Bolivia), *Journal of Geophysical Research*, 110, 10.1029/2004jd005732, 2005. 740
- Sicart, J. E., Espinoza, J. C., Quéno, L., and Medina, M.: Radiative properties of clouds over a tropical Bolivian glacier: seasonal variations and relationship with regional atmospheric circulation, *International Journal of Climatology*, 36, 3116-3128, 10.1002/joc.4540, 2016.
- 745 Sicart, J. E., Pomeroy, J. W., Essery, R. L. H., and Bewley, D.: Incoming longwave radiation to melting snow: observations, sensitivity and estimation in Northern environments, *Hydrological Processes*, 20, 3697-3708, 10.1002/hyp.6383, 2006.
- van den Broeke, M. R., Smeets, C. J. P. P., and van de Wal, R. S. W.: The seasonal cycle and interannual variability of surface energy balance and melt in the ablation zone of the west Greenland ice sheet, *The Cryosphere*, 5, 377-390, 10.5194/tc-5-377-2011, 2011.
- van den Broeke, M. R., Smeets, C. J. P. P., Ettema, J., Kuipers Munneke, P., Smeets, P., Ettema, J., and Munneke, P. K.: 750 Surface radiation balance in the ablation zone of the west Greenland ice sheet, *Journal of Geophysical Research*, 113, D13105-D13105, 10.1029/2007JD009283, 2008.
- Van Tricht, K., Lhermitte, S., Lenaerts, J. T., Gorodetskaya, I. V., L'Ecuyer, T. S., Noel, B., van den Broeke, M. R., Turner, D. D., and van Lipzig, N. P.: Clouds enhance Greenland ice sheet meltwater runoff, *Nature Communications*, 7, 10266, 10.1038/ncomms10266, 2016.

755 Zekollari, H., Huss, M., and Farinotti, D.: Modelling the future evolution of glaciers in the European Alps under the EURO-CORDEX RCM ensemble, *The Cryosphere*, 13, 1125-1146, 10.5194/tc-13-1125-2019, 2019.

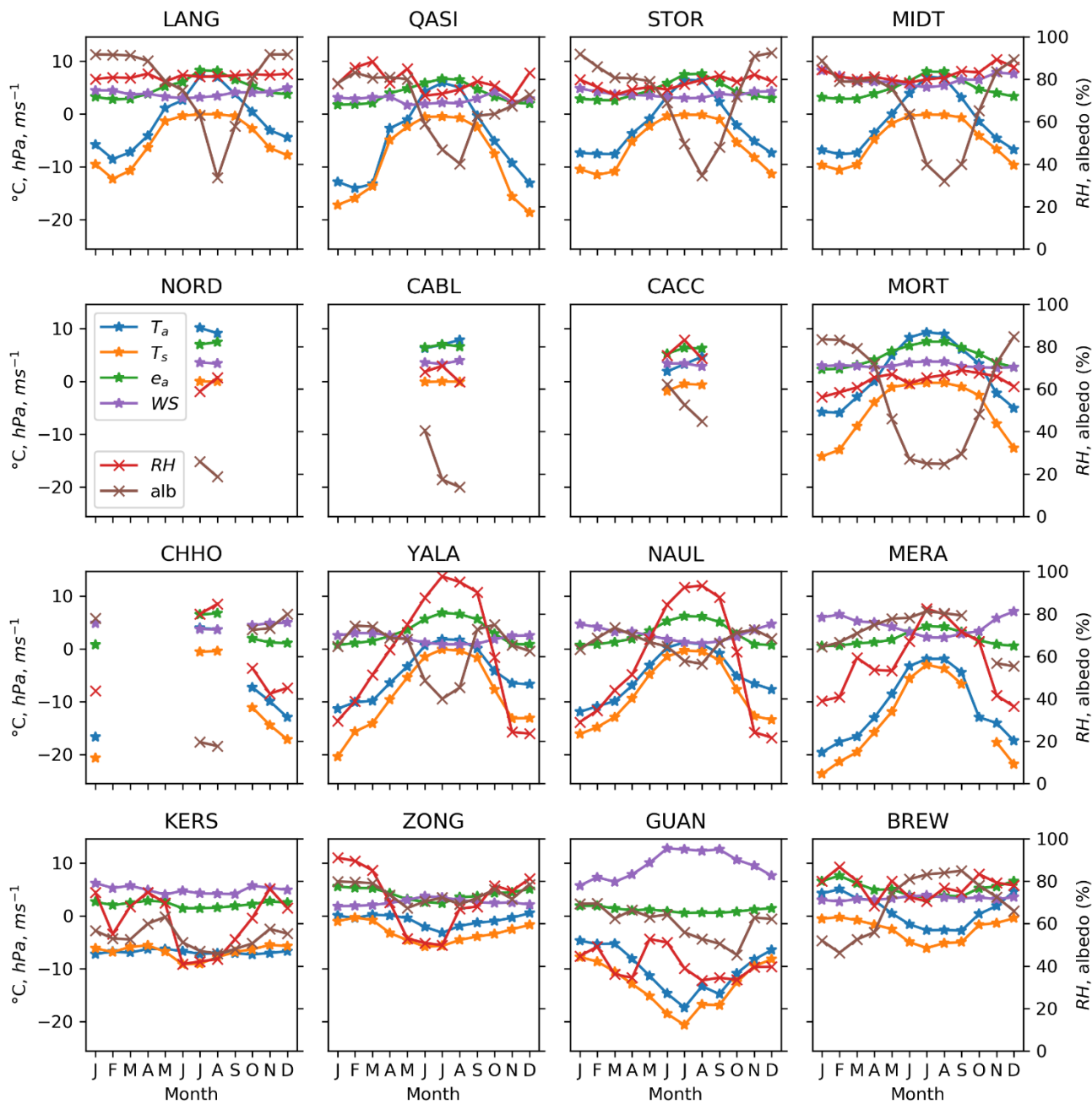
Zemp, M., Huss, M., Thibert, E., Eckert, N., McNabb, R., Huber, J., Barandun, M., Machguth, H., Nussbaumer, S. U., Gartner-Roer, I., Thomson, L., Paul, F., Maussion, F., Kutuzov, S., and Cogley, J. G.: Global glacier mass changes and their contributions to sea-level rise from 1961 to 2016, *Nature*, 568, 382-386, 10.1038/s41586-019-1071-0, 2019.

760

Appendix:

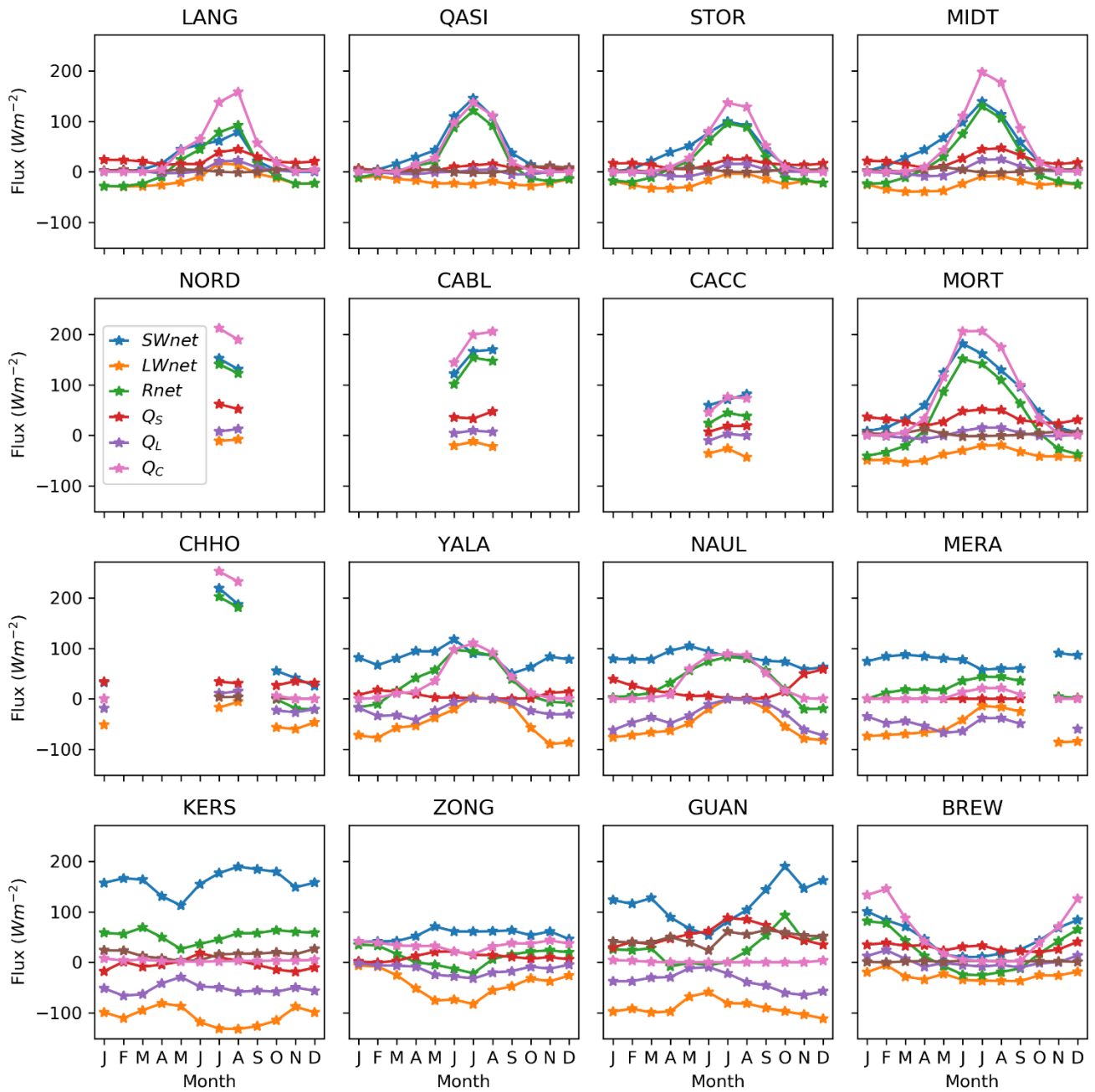
Table A1: Optimised clear-sky emissivity coefficients and error in ϵ_{cs} .

Site	Fitted value of b	Root-mean squares error of calculated ϵ_{cs} vs ϵ_{eff} in selected clear-sky conditions
BREW	0.443	0.0190
CHHO	0.538	0.0280
CABL	0.483	0.0199
CACC	0.436	0.0190
GUAN	0.379	0.0292
KERS	0.291	0.0236
LANG	0.458	0.0201
MERA	0.472	0.0391
MIDT	0.428	0.0166
MORT	0.398	0.0240
NAUL	0.495	0.0378
NORD	0.489	0.0202
QASI	0.466	0.0124
STOR	0.463	0.0171
YALA	0.468	0.0240
ZONG	0.443	0.0251



765

Figure A1: Monthly average near-surface meteorological conditions at each site. Note monthly value only shown for a site if > 10 complete days in month across full record.



770 **Figure A2: Monthly average SEB fluxes at each site. Note monthly value only shown for a site if > 10 complete days in month across full record.**

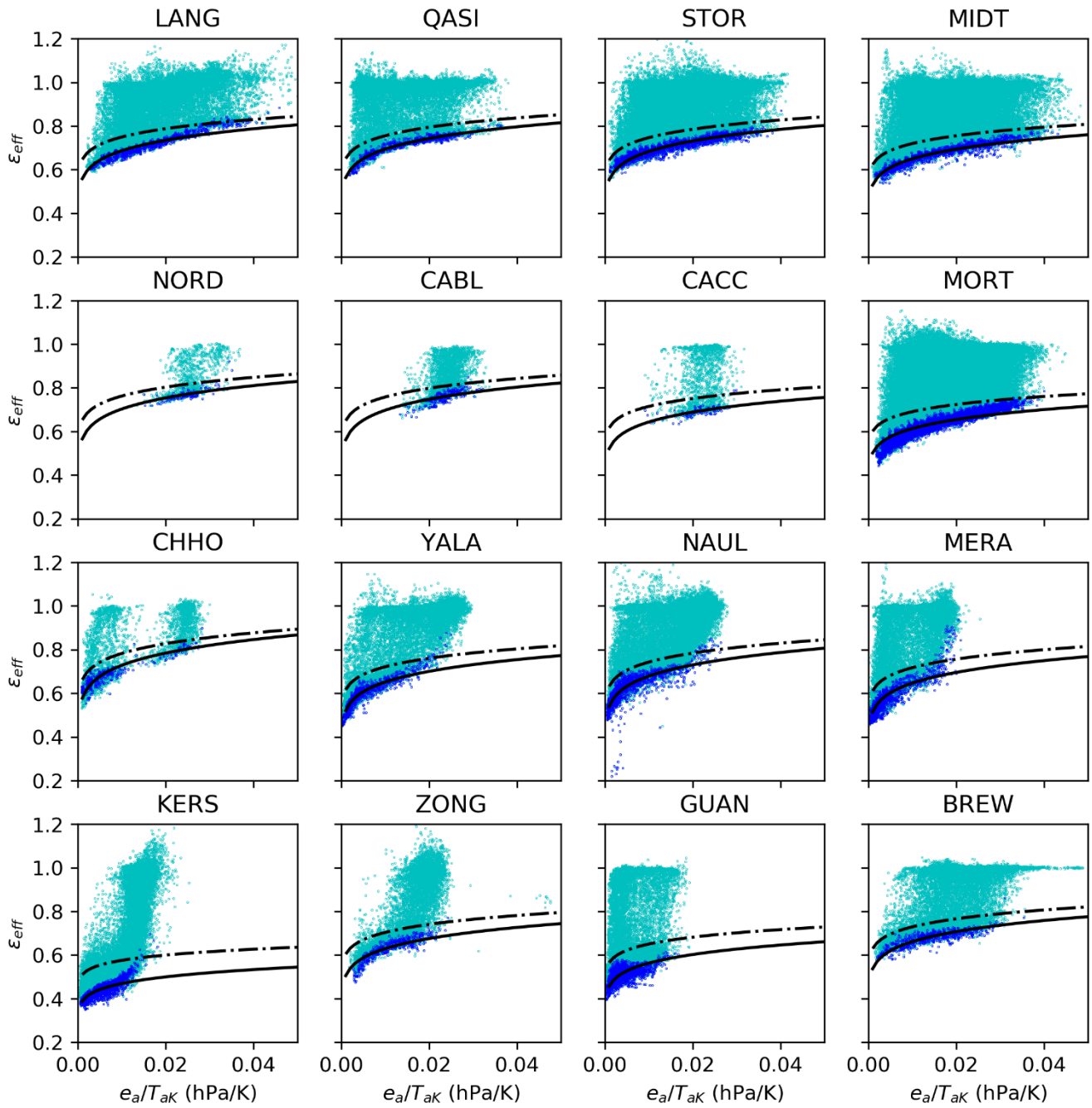


Figure A3: Observed ϵ_{eff} (points) and calculated ϵ_{cs} (solid line) fitted to lowest 10% of $LWin$ in 30 e_a/T_{aK} bins (shown in blue). Calculated ϵ_{eff} at clear-sky limit of $N_\epsilon = 0.2$ (dash-dotted line).

775

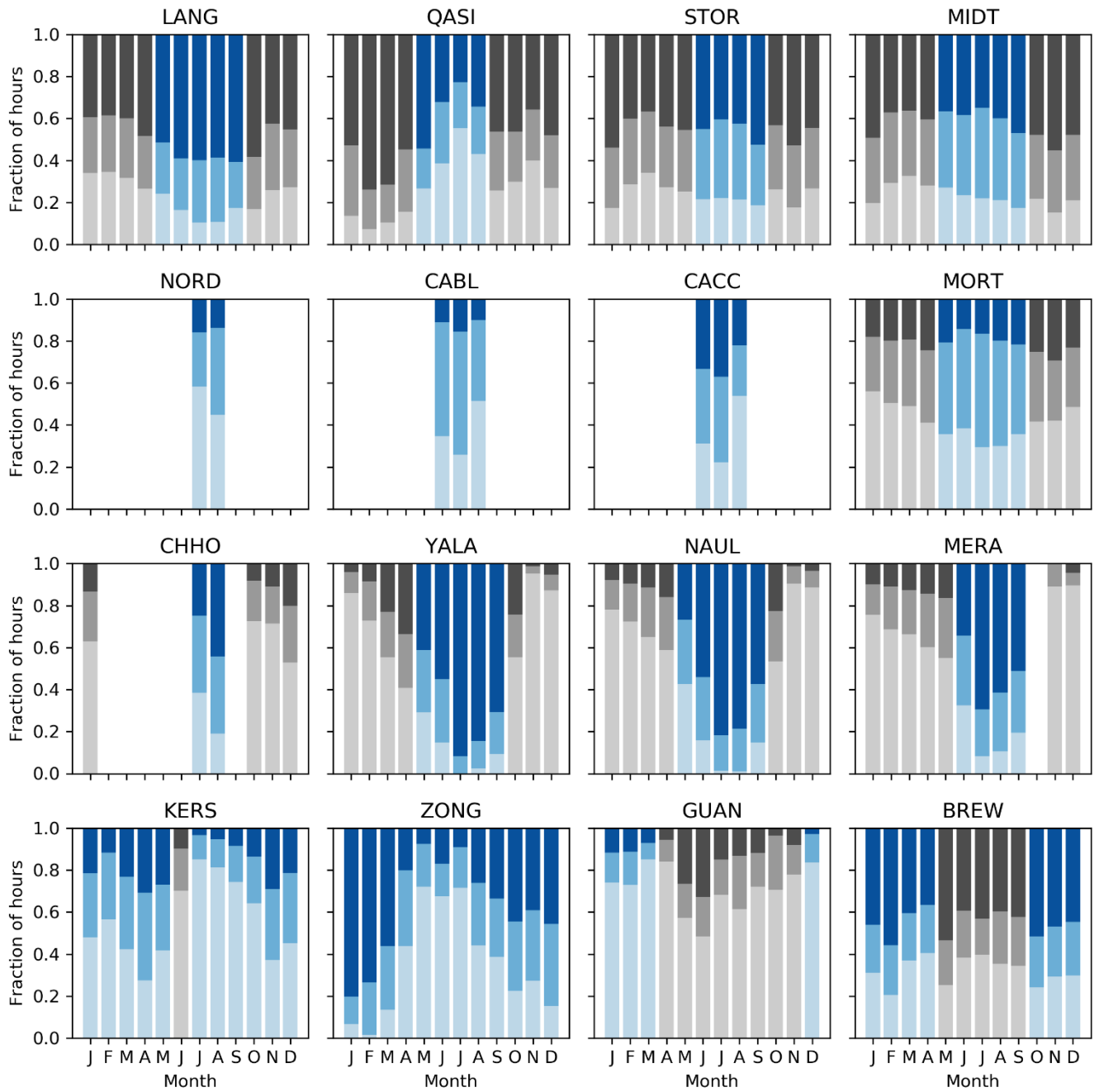
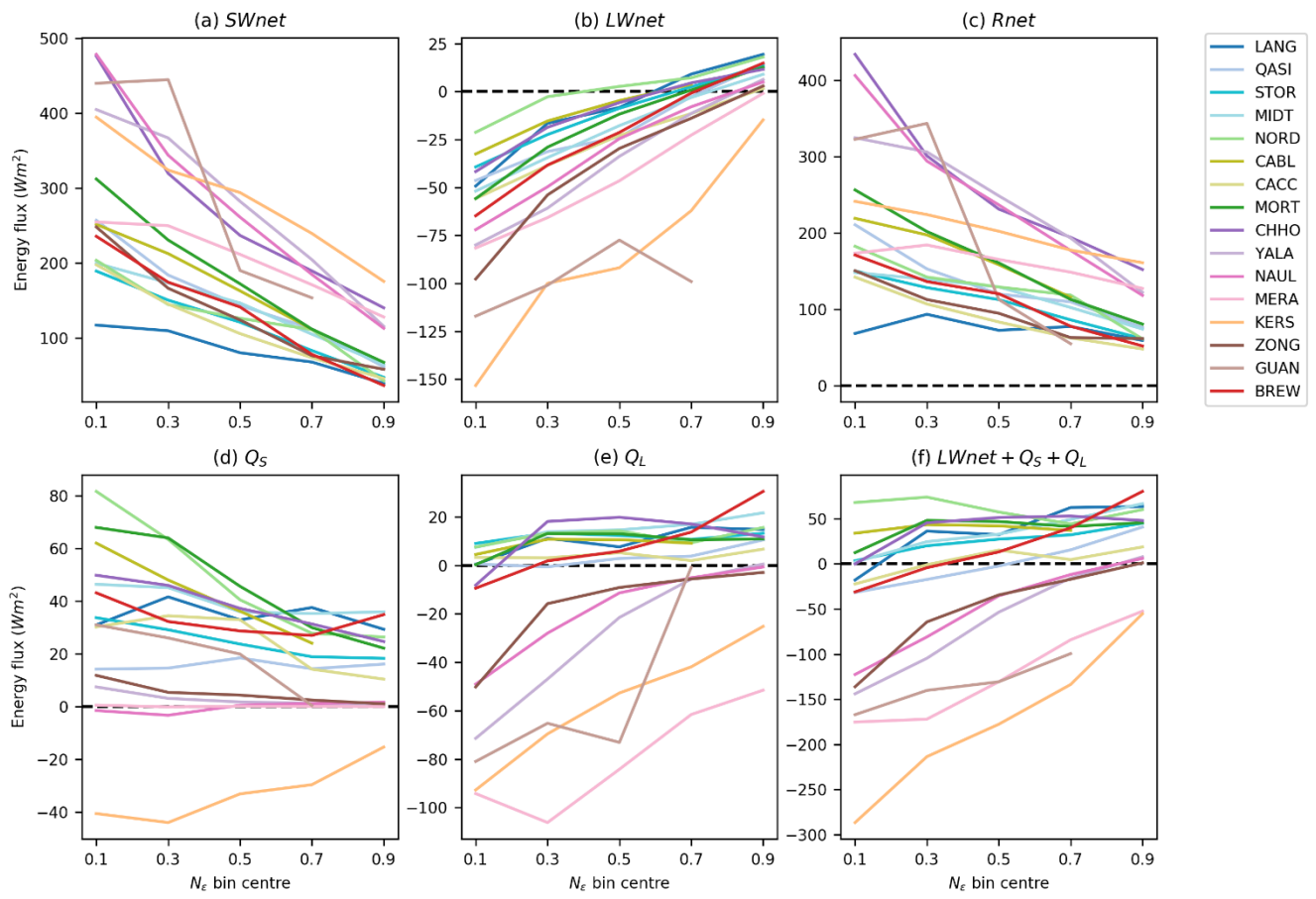
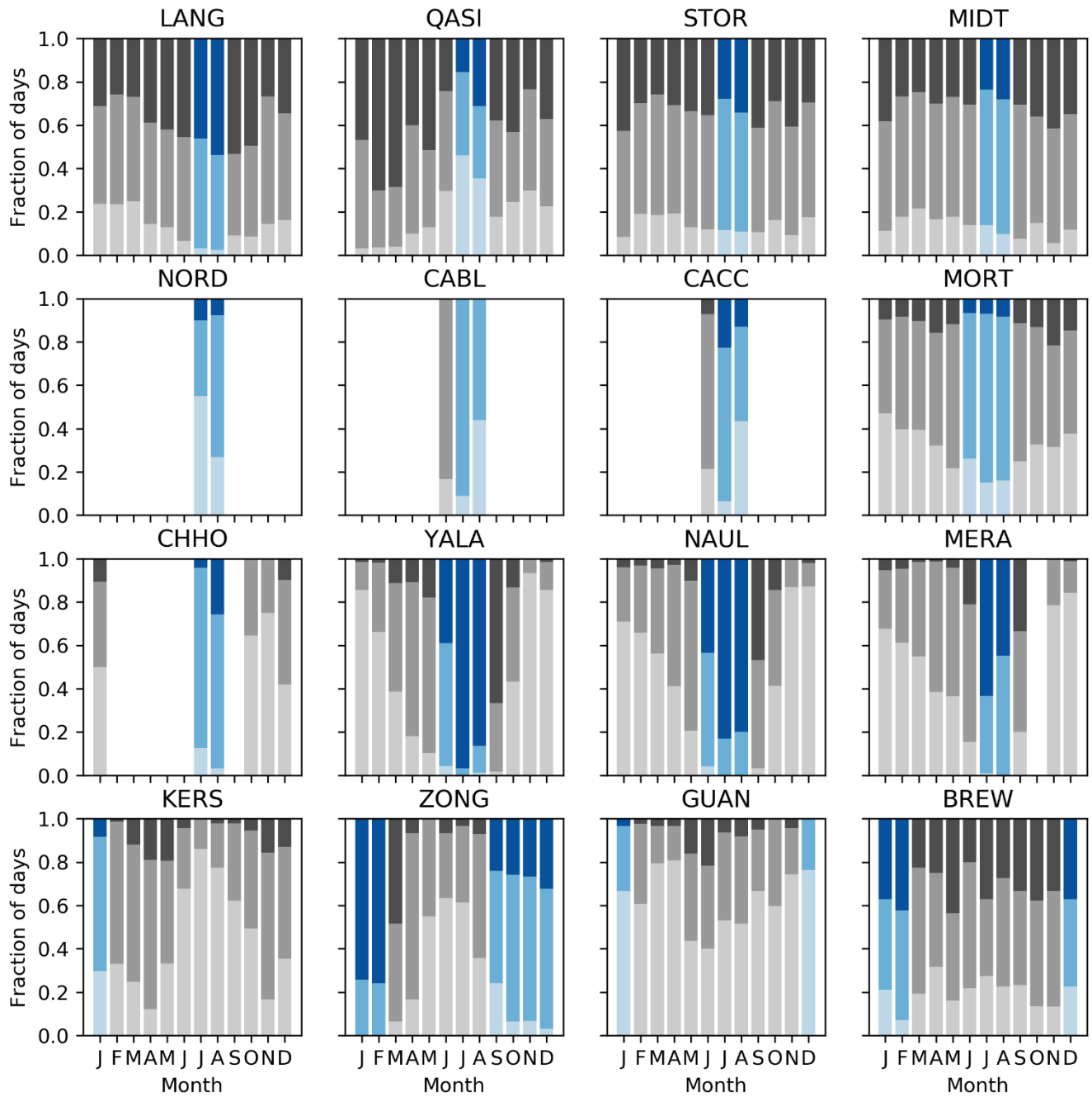


Figure A4: Monthly fraction of clear-sky (light shading), partial-cloud (mid shading) and overcast conditions (dark shading) defined using hourly cloudiness (N_e). Months defined as within the ‘melt season’ are shaded blue.



780

Figure A5: Average melt season SEB terms during hours with surface melt for different cloud conditions (N_e).



785 **Figure A6:** As for Figure 5 but with months with $> 80\%$ of maximum monthly-average Q_M shaded blue. Bars show monthly fraction of clear-sky (light shading), partial-cloud (mid shading) and overcast conditions (dark shading) defined using daily average cloudiness (N_ε).