# Authors responses on the referee comments on the manuscript "The added value of high resolution in estimating the surface mass balance in southern Greenland"

Willem Jan van de Berg, Erik van Meijgaard and Bert van Ulft.

First of all, we would like to thank the referees for their constructive and detailed comments which helped to improve the manuscript. We have tried to incorporate all comments as good as possible.

The biggest concern raised is the 2.2 km simulation carried out with the hydrostatic model RACMO2. This concern is valid, applying RACMO2 at this resolution is violating incorporated assumptions on atmospheric hydrostatics and the representation of convection. Indeed, this manuscript should not give any room to be an excuse or motivation to use hydrostatic models on resolutions below 5 km for any operational simulations. Conversely, it should provide groups using a non-hydrostatic model, which are inherently more computationally expensive, further arguments for their approach.

Nonetheless, we believe that using RACMO2 at 2.2 km resolution in this academic study is justified as there is no other method than discussing flawed results to demonstrate that overstepping the resolution indeed lead to incorrect model behavior.

The comments by the reviewer are displayed in purple and citations of the revised manuscript text are displayed in Italics. Page numbers and line numbers always refer to those in the unrevised discussion paper.

In this document first the comments of the reviewers are discussed in detail. Next, a comparison of model results with observations is given. This discussion is added here as it is requested by a reviewer, but deemed unsuitable to be used in the manuscript. Finally, the revised manuscript with track changes is added. New text is listed in blue, removed text in red.

# **Reviewer 1:**

R: In this paper, the authors investigate and discuss dependency of the Greenland ice sheet (GrIS) surface mass balance (SMB) estimates by the polar regional climate model RACMO2 on the choice of horizontal resolution set in the model (60, 20, 6.6, and 2.2 km). They highlight that setting a high horizontal resolution in the model is as important as making realistic initialization of firn physical conditions, simulating realistic ice albedo, estimating the accurate surface turbulent heat flux, and preventing positional displacement of precipitation systems in the model. This paper is very detailed, informative, and constructed well, so, this reviewer could enjoy reading it. A: Thanks for these positive words.

R: However, I had a fundamental question about the authors' view on "the limitation of the hydrostatic assumption". I think the horizontal resolution of 6.6 km would be the maximum permissible limit for a hydrostatic atmospheric model like RACMO2, although I would set more than 10 km if I do the same things. In general, precipitating convective systems (its horizontal scale is not much wider than its vertical scale in general), which should be tried to resolve explicitly if an atmospheric model's horizontal resolution becomes less than about 10 km, cannot be simulated realistically by a hydrostatic atmospheric model due to "the limitation of the hydrostatic assumption". The horizontal resolution of 2.2 km for a hydrostatic atmospheric model is obviously out of the application range.

Therefore, I thought presenting/discussing results from the 2.2 km run is not a good idea. An important but indistinct point of this study is whether the authors use a convective parameterization scheme in RACMO2 or not. Only if the authors use such a scheme and they have tuned it for high-resolution (less than 10 km) simulations around the GrIS well, the 2.2 km run would be worth trying. In the following part, this reviewer gives specific comments. Please note that page and line numbers are denoted by "P" and "L", respectively.

A: We agree with the reviewer that using a hydrostatic model for simulations at resolutions below 5 km is not a good practice. However, this paper is meant to reaffirm this limit by demonstrating that the model results include fundamental flaws. This message is in the main text somewhat clouded by the fact that the modelled SMB at 2.2 km is better than the SMB modelled at lower resolutions. Nonetheless, we believe that is worth to demonstrate that also for the polar conditions of the Greenland Ice Sheet, where mesoscale convection is virtually non-existent, the hydrostatic assumption is still invalid.

Concerning convection, parameterizations have not been altered nor switched off or on. We have not considered to change anything on the parameterization of convection for two reasons. Firstly, convective precipitation is relatively unimportant over the ice sheet, see Figure R1 in this document. Secondly, even if we had adopted the best approach in the representation of convection, the results would show to be physically invalid. Hence, any effort to adopt the parameterization of convection to represent only smaller scale motion would be in vain.

Nonetheless, to make both points more clear in the manuscript, it is now mentioned numerous times that the 2.2 km simulation is invalid. Furthermore, it is discussed in detail that the representation of convection leads to undesired model behavior. See the responses on the specific comments for these changes in the manuscript.

# Specific comments (major)

R: P. 3, L. 45 \_ 48: In recent years, several attempts to develop non-hydrostatic regional models that can calculate temporal evolution of the GrIS SMB have been made (Mottram et al., 2017; Niwano et al., 2018). Please consider indicating this point here.

A: Thanks for these suggestions. We added the following sentence at this point: "Nonetheless, non-hydrostatic models like WRF, NHM-SMAP and HARMONIE are increasingly applied for glaciated regions, e.g. Hines and Bromwich (2008); Mottram et al. (2017); Niwano et al. (2018); DuVivier and Cassano (2013), but due to their non-hydrostatic dynamical cores their computational costs are higher than hydrostatic models."

R: Sect. 2.1: Do the authors use a convective parameterization scheme in RACMO2? If the authors use such a scheme in the model, do they use the same scheme/setting for all the simulations introduced here? This is an important point of this study, so please explain it here.

A: We have used the default convective parameterization of IFS version cy33r1 with equal settings for all simulations. We agree with the reviewer that if we aimed to present as realistic as possible results at 2.2 km resolution, it would be major flaw. Obtaining as realistic results as possible is, however, not our intention. Our aim is to show that, even though the results may look good, the results are non-valid as the modelled atmospheric circulation violates the hydrostatic flow assumption. We do not analysed the existence of undesired interaction between the implicit and explicit representation of convection at this resolution as it was not deemed very relevant within this context. To clarify the choices around convection, we added to section 2.1: "The parameterization of convection in the IFS physics uses an adapted version of the model presented by Tiedtke (1989). This module is used for all simulations, also for the run at 2.2 km resolution. The choice has drawbacks, as the parametization of convective clouds can start competing with the explicitly resolved mesoscale convective systems, reducing the quality of the model results. However, it should be kept in mind that this 2.2 km is run and discussed to show that RACMO2 is unsuitable for this resolution, irrespective of the quality of the modelled SMB. Furthermore, convection precipitation is of limited importance for the SMB the GrIS, where convection is generally weak and limited to summertime."

R: Sections 2.1 and 2.2: The authors recognize the limitation of the hydrostatic assumption (P. 3, L. 44); however, they apply a hydrostatic model (RACMO2) at very high resolutions of 6.6 and 2.2 km. The authors' intention here is not clear.

A: To express more clearly our intention of the various simulations, we added to the introduction the following sentences: "The simulation at 2.2 km has been performed to investigate to which extent violating the assumptions made in RACMO2, thus hydrostatic atmospheric flow and that convective motion must be fully parameterized, deteriorate the model results. The results presented here, therefore, provide by no means any justification to apply a hydrostatic model on resolutions below 5 km on operational basis."

P. 8, L. 188 - 189: Ettema et al. (2009) showed that precipitation rates over the GrIS can be increased for higher-resolution simulations with hydrostatic atmospheric models. However, in this study, the precipitation rate from the 2.2 km RACMO2 run is smaller than that from the 6.6 km RACMO2 run (Table 2). What is the main reason of this result? Please discuss.

A: In hind view, only in the simulations presented by Ettema et al. (2009), this effect occurred very profoundly. The cause is that by resolving the topography in more detail, precipitation is concentrated on the ice sheet instead of more evenly distribution on and off the ice sheet. For the 2.2 km simulation, different mechanisms are active, as will be discussed later in the manuscript. To clarify this, we added at this point: "Up to 6.6 km resolution, the mean precipitation increases due to grid refining because resolving the topography induces that precipitation is concentrated on the ice sheet, which is higher than the surrounding areas, instead of around it. The decrease of mean precipitation for the 2.2 km resolution run will be discussed in detail in Section 3.4."

R: P. 17, L. 332 \_ 334: The result described here is interesting: more precipitation occurs over not GrIS but tundra in the 2.2 km run than the 6.6 km run (I feel the result indicated here is plausible). Could the authors discuss more about possible reasons for this (what happens in the model?) here? It would be informative for readers.

A: We did not calculate whether the tundra receives more or less precipitation in the 2.2 km simulation compared to the 6.6 km simulation. For sure is that the variability is much stronger enhanced than over the Greenland Ice Sheet. It is all related with the small scale orographic variability, which is much lower over the ice sheet than over the surrounding mountains and tundra region. To make this more clear, we added at this point: "These patterns are stronger over the more rugged coastal mountains (southeastern coast) and tundra zone (southwestern coast) than over the ice sheet as ice sheets strongly dampen topographic gradients due to the diffusive nature of ice flow."

R: P. 17, L. 335 \_ 336: Why does the not-small difference in precipitation rates from the 2.2 and 6.6 km runs (25 \_ 100 mm w.e. a-1) occur also over sea? Is it related to activities of cyclones and/or frontal systems in the area? Please discuss.

A: It is due to the different response of the convective scheme. We added a discussion on change in the precipitation patterns over sea: "Over sea, changes are due to different processes. Figure S4c shows that large-scale precipitation is rather uniformly reduced over the whole Atlantic sector in the model domain in the 2.2 km simulation. Similar reductions, now for ocean grid points, are visible between the 6.6 and 20 km simulation (Fig. S4e) and, to a lesser extent, between the 20 and 60 km simulation (not shown). No clear explanation nor reason has been found for this decrease. Away from the coast convective precipitation is enhanced in the 2.2 km simulation compared to the 6.6 km simulation (Fig. S4d). This enhanced convection is likely surface temperature driven, as this convective precipitation is not observed along the Greenland coast where sea surface temperatures are lower due to the East Greenland Current and seasonal sea ice. Given the importance of convective precipitation 425 over the Atlantic Ocean, the validity of the model results is seriously affected by the choice to keep the parameterization of convection equal for all model resolutions. Even though convection in these cold, shallow tropospheric atmospheric conditions may remain on kilometre scales, thus at a similar scale as the 2.2 km model grid resolution, it is disputable at least whether the used approach for convection is right."

R: P. 19, L. 366 \_ 368: The authors' logic here is comprehensible basically; however, how can we understand the argument that RACMO2 can be applied at resolutions down to about 5 km? In general, precipitating convective systems (its horizontal scale is not much wider than its vertical scale in general), which should be resolved realistically if an atmospheric model's horizontal resolution becomes less than about 10 km, cannot be simulated/reproduced realistically by a hydrostatic atmospheric model: I understand it is a specific example of the limitation of the hydrostatic assumption. Is it OK to understand precipitations over Greenland are caused mainly by non-convective systems? I think maybe no. In this regard, I assume the choice/setting of a convective parameterization scheme in RACMO2 plays a key role of the result (please also see my major comment at Sect. 2.1 indicated above).

A: Convective precipitation is of minor importance over the Greenland Ice Sheet, the relative contribution ranges from 10% along to margins to 2%, see Figure R1 in this document. Over the ocean, convective precipitation is very substantial. In the simulation at 2.2 km resolution, the enhanced convective precipitation compared to the 6.6 km resolution simulation (Fig. S4d) demonstrates that the convective scheme indeed performs 'differently' at this low resolution. However, no similar difference is observed between the 6.6 and 20 km resolution simulation (Fig. S4f), which strengthens the conclusion that for this polar context, a resolution of 5 km is still appropriate. It should be noted that in these cold conditions, convective cells are smaller than in the mid-latitudes or near the equator.

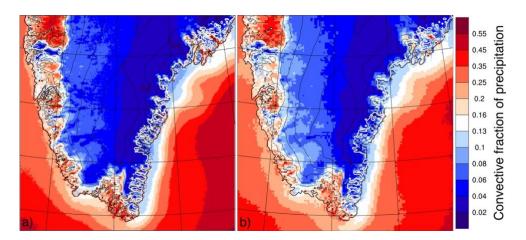


Figure R1: Fraction of convective precipitation of the total precipitation for the a) 2.2 km and b) 6.6 km simulation.

# R1, Specific comments (minor)

R: P. 3, L. 52-65: This reviewer understands that the RACMO2 simulation at the horizontal resolution of 60 km is assumed to be an ESM-equivalent run in this study. However, is it a reasonable assumption? Because RACMO2 is forced by the ECMWF Operational Analyses (P. 5, L. 117), its performance might be better than ESM simulations in general. Usually, ESM simulations do not refer to such spatially and temporally detailed and realistic information.

A: We can understand that this connection, thus that the 60 km simulation represents an ESM, can and will be made. However, this 60 km simply has arisen from to choice that the grid refinement step was a factor 3 and that the highest tried resolution was 0.02 degree. Furthermore, applying an even lower resolution would pose practical problems as RACMO2 cannot be run with very few model grid points. Nevertheless, a resolution of 60 km is indeed optimistic for ESM, for which now typically 1 degree resolution is used. However, it is reasonable to assume that within a decade this typical resolution has gone down to something like 0.25 degree resolution. Furthermore, several ESMs with adaptive grids exists, which allows to resolve the Arctic or Greenland with 10-20 km resolution without the numerical burden to apply this resolution for the whole Earth. Finally, some ESMs get impressively close to re-analysis driven model simulations, e.g. Noël et al, TCD, (https://doi.org/10.5194/tc-2019-209

# R: P. 4, L. 76: In RACMO2, does meltwater runoff occur only at the bottom of snowpack? If an ice layer formation is simulated in the internal snowpack, what happens in the model?

A: RACMO2 employs the bucket method for meltwater flow in snow and firn. Hence, in absence of snow, all melt water runs off directly; in that case 'at the bottom of the snow pack' is somewhat inaccurate as there is no snowpack. As this specific comment, thus where the meltwater is removed from the firn column, is not very relevant, we removed it from the text. Furthermore, ice lenses are never impeding downward percolation. To clarify this, we added in 2.1: "Melt water percolation is modelled using the bucket method; if ice lenses are modelled in the firn pack, these are treated as permeable."

# P. 5, L. 102: Is there any references for the empirical formulas (also constants listed in Table 1: Ek, kc, and ks)? If no, please describe more in detail about the basic / background science of the equations.

A: Although there are no references for the specific equations used here, we not entirely conceived these equations out of nothing. They were adopted in an attempt to make the semi-physical equations presented by e.g. Arthern et al (2010), Appendix B, preform as well as the empirical equations of e.g. Ligtenberg et al. (2011). This rationale has been added to the manuscript: "Therefore, we initially explored an expression for creep of consolidated ice with cylindrical pores (Arthern et al., 2010, Eq. (B1)),  $\frac{\partial \rho}{\partial t} = k_{c,A10}(\rho_i - \rho) \exp\left[-\frac{E_{c,A10}}{RT}\right] \sigma \frac{1}{r^2}.$  The variables used in this and following Eqs. are listed in Table 1. However, we were unable to tune this relation

$$\frac{\partial \rho}{\partial t} = k_{c,A10}(\rho_i - \rho) \exp\left[-\frac{E_{c,A10}}{RT}\right] \sigma \frac{1}{r^2}$$

to match the modelled firn densities with snow density profiles from Antarctica (van den Broeke, 2008). We choose to focus on Antarctic firn cores for tuning as in the Antarctic interior melt, which significantly alter the properties of firn cores and the densification process, is not occurring. Specifically, this equation fails to represent both the fast densification of low density, fine grained snow under very weak overburden pressure and the slower densification once the snow is denser and coarser grained while the overburden pressure is orders of magnitudes bigger. However, densification partly depends on the recrystallisation of snow, which leads to a net growth of the crystals. Therefore, we modified Eq. (2) to the following empirical formula "

P. 6, L. 119 - 120: It is better to indicate reasons why the 2.2 km RACMO2 run can be conducted without an intermediate RACMO2 simulation (double-nesting).

A: We preferred single-nesting above double-nesting for a uniform model setup across the resolution analyzed. This has been added to the manuscript: "Although this 11-fold grid refinement step is bigger than typically used for high-resolution studies, it was preferred here to a double-nesting approach, as the latter would inhibit comparing simulations covering near-similar domains."

P. 6, L. 127: Please explain why "0.42" is chosen and set for the ice albedo in the model.

A: 0.42 is a typical value for bare ice of the GrIS. This notion has been added to the manuscript: "Finally, a constant ice albedo of 0.42 – a typical bare ice albedo value for the GrIS is used, instead of MODIS derived albedo as is used in Noël et al. (2015), in order to improve the comparability of the model results on various resolutions."

R: P. 11, L. 229 \_ 231: At this point, the authors have not compared model simulation results with measurement data. Therefore, I think they should not use the words like "improve" and "underestimate" here.

A: We agree with the reviewer that we are discussing whether statistical downscaling can represent higher-resolution model simulations and not observations, which are estimates of the true SMB. So, indeed, in this section we do not show that refinement methods make the results "truer", but we do show whether downscaling techniques improve the representation of high-resolution model results by low-resolution results. We have changed the wording in 3.2. at several places to make this clear. For example, P13, L 261 is now: "Finally, the representation of high-resolution SMB estimates from low-resolution SMB estimates improves through application of statistical downscaling." For all other wording changes we refer the reviewer to the track-changed manuscript attached below.

P. 14, L. 283: This is a good explanation of the analysis conducted in Sect. 3.2.3. Related to the above comment (P. 11, L. 229 \_ 231), it is better to indicate at the beginning of Sect. 3.2.3 that the discussion in the subsection 3.2.3 is an "expectation" of the effects of the refining techniques.

A: that is correct. We changed the sentence into "... provides a quantitative assessment of the expected ability ..."

R: P. 21, L. 406: Maybe, the soot concentration value of 0.10 ppmv is set by default in RACMO2 right? If so, what is the basis of the value?

A: 0.10 ppmv is indeed the default soot value in RACMO2. This value is chosen after tuning experiments with RACMO2.1 and copied as default in RACMO2.3p1, and hence used in this study too. To explain this, we added to Section 2.2 the following sentence: "The reference soot concentration is set to 0.10 ppmv, equivalent to the default value in RACMO2.1 and RACMO2.3p1 (van Angelen et al., 2012; Noël et al., 2015)."

# **Technical corrections**

R: P. 1, L. 8: It would a bit difficult to understand the exact meaning of "resembled". Can the authors replace "resembled" with another word?

A: We changed it into "resolved".

# Reviewer 2:

# **General comments**

R: In this manuscript the authors take a detailed look at the impact of varying the horizontal resolution of the RACMO2 model (from 60km to 2.2km) on the Surface Mass Balance (SMB) of the southern portion of the Greenland ice sheet. Furthermore, they incorporate the impacts of dynamical vs statistical downscaling on the SMB and its various components. Additionally, they investigate whether the resolution is the most important aspect in a modelling study by conducting sensitivity test by varying other factors such as bare ice albedo, firn initialisation and turbulent flux parameterisations. This paper is thorough and detailed, and it is clear that the authors have thought a lot about the contents of the study. However, as stated numerous times throughout the manuscript, RACMO2 is a hydrostatic model which should not be run (or with caution/parameterisations) at resolutions higher than 5km, but the authors run the model at 2.2km resolution and results from this run are included throughout the study. It is a curious choice that the authors have chosen to run at such high resolutions

regardless of the results being 'no longer physically correct', and the lower boundary on resolution in hydrostatic models is not a new finding. It is also a worry that future studies could use this paper as a basis for continuing to use high-resolution hydrostatic modelling despite their limitations, purely as they still provide a good comparison to observations. The authors should provide more information about the model set up, specifically for the convective parameterisations if they are to keep the 2.2km results.

The specific comments are outlined below.

A: We would like to thank the reviewer for his constructive comments. We indeed would like to keep the 2.2 km resolution results, for the sole aim to show that such a resolution leads to violation of the hydrostatic assumption. Yes, there is a curious coincidence that the 2.2 km results perform best, but if the reviewer believes that the revised manuscript still leaves room to conclude by readers that using 2.2 km resolution with a hydrostatic model for over Greenland and it surroundings is a sound idea, we are happy to state the invalidity of the hydrostatic assumption even stronger. We refer the reviewer for specific changes to the discussion of specific comments and the attached manuscript with track changes.

# Major suggestions:

R: Pg 3, Ln 60: Can you justify why you have used the 2.2km resolution run when hydrostatic models do not hold for such high resolutions? See general comments above.

A: The justification for trying is simply to inquire how wrong or right the model will be. The reason for discussing the results in this manuscript is that there are very few papers that this clearly demonstrate that violating the hydrostatic assumptions lead to unphysical model behavior. Yes, we use the model results more extensively than the very minimal; conversely, we are humbly aware that 'all models are wrong but some are useful' (George Box). To add justification and context, we added the following sentence at this point: "The simulation at 2.2 km has been performed to investigate to which extent violating the assumptions made in RACMO2, thus hydrostatic atmospheric flow and that convective motion must be fully parameterized, deteriorate the model results. The results presented here, therefore, provide by no means any justification to apply a hydrostatic model on resolutions below 5 km on operational basis."

R: Pg 3, Ln 46: Please provide examples of non-hydrostatic modelling of Greenland and the Arctic. Specifically, the Polar WRF model has been used quite frequently over Greenland for various climate studies (e.g Hines & Bromwich, 2008., Hines et al. 2011., Duviver & Cassano 2013., Turton et al in discussion with Earth System Science Data). Similarly, Niwano et al (2018) used a non-hydrostatic model coupled with a snow model, and Mottram et al (2017) used the non-hydrostatic HARMONIE model.

A: Thanks for these additions. The following line has been added: "Nonetheless, non-hydrostatic models like WRF, NHM-SMAP and HARMONIE are increasingly applied for glaciated regions, e.g. Hines and Bromwich (2008); Mottram et al. (2017); Niwano et al. (2018); DuVivier and Cassano (2013), but due to their non-hydrostatic dynamical cores their computational costs are higher than hydrostatic models."

R: Section 2.2: What timestep was used in the model for each resolution? Later in the manuscript you mention 'similar' timesteps, but what are they? What is the height of your lowest model level for each resolution? Will these have an impact on your turbulent flux estimations?

A: We added information on the time step at this point in the manuscript: "Runs at the four resolutions were carried out with a time step of 150, 150, 150/90 and 60 s, respectively. For the 6.6 km simulation, the smaller time step of 90 s was only used for months with high wind speeds which causes the Lagrangian advection scheme to fail at processor sub-domain boundaries. In the 2.2 simulation, this problem was mitigated by extending the shared-data rim around sub-domains from 6 to 8 grid boxes."

We also added information on the elevation of the lowermost model levels: "The lowest model levels were at approximately 10, 30 and 90 m, respectively, above the surface." As this mesh has not been varied for the various resolution, there is also no potential impact on the resolved turbulence.

Section 3.2.3 onwards: Taylor diagrams can be difficult to immediately understand, and there are lots of information on them, including shapes, colours and numbers. Whilst you give a good description on how to interpret them, a lot of back and forth between the figures, description and results is required to fully compare results and figures. Help the readers by pointing out features of the diagram within the text. For example, Pg 17, In 321 you say 'little to no gain in performance is seen between the results'. It would be useful to follow this with 'as seen in Figure 7b by the clustering of numbers 2,3,4 of the \* shape'. Or similar. The authors should go back through the text to see where this information is required.

A: We have gone through the text to improve this. In order to keep this document readable, we refer the reviewer to the track-changed manuscript added below. In the specific case mentioned by the reviewer, we have added: ".... no added value, as the stars belonging to these resolutions are clustered in both panels."

R: Section 3.4, Pg 17, Ln 332 onwards: Why is precipitation reduced in the 2.2km runs? Do you parameterise convection in RACMO2 for any of your runs? Or change any of the setup between runs? It would be useful to include a sensitivity test of convective parameters and how this affects precipitation as it is both an important and erroneous component of the SMB.

A: It is reduced as due to enhanced rain-out over sharp mountains and convection over warmer ocean, the air is drier, leaving less moisture available for precipitation elsewhere. As now discussed in the methods sections, the parameterization of convection is left equal. The simulation 2.2 km is meant for academic reasons; it shows than RACMO is not suitable for this resolution, and not only due to the parameterization of convection. A sensitivity test on 2.2 km with a correctly adjusted convective scheme will still not show that this resolution is sound as the topographic waves will remain. A sensitivity experiment in section 3.5 could be another option, but we did not chose for this option. Firstly, convective precipitation is of minor importance over the ice sheet (Fig. R1, Fig. S4). Secondly, retuning of all cloud-content-to-precipitation parameters has a much stronger impact than adjusting the convective precipitation only. Thirdly, we believe, but that is hard to prove without simulations, that the usage of a 3-species cloud scheme without explicitly separated cloud ice and cloud liquid water and that neglecting the horizontal transport of falling precipitation will change the modelled precipitation patterns more than that a single sensitivity test can reveal. Nonetheless, we agree with the reviewer that it should be stressed that many improvements can be gained by improving the precipitation.

R: Pg 18, Ln 342 to 350: This section reads a little confusing. At the start you say that higher temperature and wind speeds contribute to the increased SHF. Towards the end of the paragraph you say that heat advection from the increased resolution is responsible. You should combine these lines of thought, as I assume they are all related to the resolution. Or was the initial sentence (increase T and WS) only related to melt events, and the latter to the full period? Do you have any AWS observations of SHF to compare with? As you could then provide a more definitive assessment than 'SHF fluxes near the margin are probably realistic'.

A: As Figure 8c shows the difference in SHF for the whole period, but enhanced SHF is only directly affecting the SMB during melt, we needed to tests whether in the 2.2 km simulation, also higher SHF occurs during melt event, otherwise the patterns in Figure 8c have no effect on the SMB. This is indeed the case.

Concerning the wording, we tried to clarify the intention by rewording the specific sentences to: "Runoff is further enhanced in the 2.2 km run by a higher sensible heat 390 flux (SHF) towards the surface in the outer 20 km of the ice sheet (Fig. 8c). More detailed analysis (not shown) reveals that SHF is also increased during melt events, thus indeed enhances melt, and that both higher atmospheric temperatures and higher wind speeds contribute to the increase of SHF during melt events. Observations from automated weather stations (AWSs) point out that heat advection onto the ice sheet is a major driver of melt in the lower ablation zone, and the contribution of the SHF to melt is often underestimated in (regional) climate models (Fausto et al., 2016). However, it cannot be proven that the higher SHF is more realistic. An equivalent analysis of the 6.6 km results with respect to the 20 km results (Fig. S3c) reveals a similar increase of SHF, however spread over a threefold

wider zone and a lower magnitude to at most 10 W m<sup>-2</sup>. Since all model runs were performed with the same settings and similar time step lengths, the most probable reason for the increase of SHF is that a finer resolution allows for more dynamic heat advection onto the ice sheet at length scales up to ten times the grid resolution." Lastly, we dived into a comparison of model with AWS observations, for which we chosen to use PROMICE data from south Greenland (www.promice.dk). Although we conclude from this analysis that "..., it cannot be proven that the higher SHF is more realistic", we assessed that the analysis included too many unresolved uncertainties to be included in the manuscript or supplementary materials. We added the analysis, the methods and its discussion below.

R: Pg 19, Ln 367-369: Why do you go down to 2.2km resolution then? See general comments.

A: Shortly speaking, to demonstrate it indeed leads to non-physical model behavior. See general response.

# Minor suggestions:

R: P1 Abstract, Ln 2: please add the time period that you cover, in brackets is fine.

A: Done

R: P1 Abstract, Ln 13: '25km is sufficient'- where do you get this value from when you use 60km and 20km, and I struggle to find a reference to 25km in the manuscript.

A: We cannot refute this, therefore, the value is changed to 20 km.

R: Figure 1: The purple and red dots on Figure 1c and d are very similar looking. Could you try a different colour, or fill the dots on one? Also, later in the text you refer to the purple ones as 'magenta' which is a better description than purple.

A: In Figure 1c there are only magenta dots, all red dots are in Figure 1d. The red dot-like structures along the margin in Figure 1c are disconnected ice-free or ice-covered regions. As all dots are have a white fill, we believe that these red structures, which are not white filled, are distinctly different to the magenta dots. We believe that the figure caption and Section 2.4 is sufficiently clear in which subfigure which dots are drawn, so we did not change the figure, figure caption and Section 2.4. However, if the reviewer continues to disagree on this point, we are surely willing replace the magenta by another point. We replaced "purple" by "magenta in the figure caption.

R: Pg 4, Ln 89: Unstable and convective conditions are regularly observed in summer. E.g Cohen et al 2007, Box et al 2001 (PhD thesis).

A: We agree on that point, but as these situations are much less common, we did not mention the used parametrization for unstable boundary layers. To avoid the impression that the model cannot handle these situations, we added the following sentence: "In case of unstable conditions, the flux profiles of Dyer and Hicks (1970) are used."

R: Pg 6: Ln 133: 'all methods are applied on time-averaged quantities and not on daily SMB fields'. What is the output frequency of your runs, and what time-average was used for output?

A: Our apologies for the confusion. For all flux fields like SMB and its components, accumulated fields (at time-step level) are used, so the output frequency (mostly 6 hourly) is not very relevant. The time-average period is the period of consideration, e.g. October 2007 to September 2014. To avoid this confusion, the sentence has been changed to: "All methods are applied on period-averaged accumulated quantities and not on daily accumulated SMB fields."

R: Figure 2: October 2008- September 2014 is correct? Or should it say October 2007? If you do not include 2007, why?

A: No, this was indeed wrong, it should say October 2007.

R: Figure 3: Please add a label/marker for Sukkertoppen as it is relevant for section 3.2.1. Just on one subfigure is fine

R: We got beaten by the Danish/Greenlandic geographical name confusion. Sukkertoppen equals the Maniitsoq ice cap, already located in Figure 2c. However, as North of Maniisoq would give new confusions, an additional label has been added in Figure 2c.

R: Figure 4 caption: Write out the full caption, as there is a lot of information on this figure.

The white line marking the ice sheet margin is missing.

A: Done. In Figure 4 there is no white line as only data on the ice sheet is shown, so a white line is redundant. R: Pg 11, Ln 228: Also highlight Figure 4f for numerical artefacts.

A: The striped patterns in Figure 4f are not artefacts. Away from the margins, the topography is already rather well represented at 60 km resolution, so details of the topography becomes important. As the ice sheet surface is convex, at the edges of the 60 km grid boxes, the ice sheet elevation is higher than the linear gradient. As the statistically downscaled runoff would be more-or-less equal to the linear interpolated runoff if the topography would change linearly, the convex shape of the ice sheet leads to lower runoff estimates. We added the following text: "Due to the north-south orientation of the ice sheet, this introduces a striped difference pattern between linearly and statistically downscaled runoff (Fig. 4f)."

R: Pg 12, Ln 246/247: Refer to figure 5a.

A: As a reference is already made to this figure in the preceding sentence, we added "in this figure" to the sentence: "Crude nearest-neighbour interpolated fields are also assessed in this figure in order to quantify if bilinear interpolation is better than no efforts at all."

R: Pg 13, Ln 257: 'significantly less variability' - have you tested the difference in variability with statistical tests?

A: No, we did not test it, but it is simple to argue why it is definitely significant. The variance in the snow drift divergence doubles for each resolution increase step. The 60 km simulation has 88 ice points, so the 95% uncertainty range in the standard deviation is about 20% (see for example <a href="https://en.wikipedia.org/wiki/Standard deviation">https://en.wikipedia.org/wiki/Standard deviation</a>). For all other simulations, for which the number of glaciated points is far higher, this uncertainty range is even smaller. So, it is very unlikely that for any of the resolutions, the snow drift variability is actually a factor 2 different than estimated, hence the difference is significant.

R: Pg 13, Ln 270 onwards: can you include a spatial plot (like Fig 3 or 4) of the snow drift differences, as it would be easier to interpret line 270 to 280, especially the 'very different patterns' (Ln 275).

A: Given the limited impact of snow drift divergence on the SMB, we believe this figure is not relevant enough for the main text. Therefore, we have created a supplementary figures document, in which we displayed this graph. And, for consistency, we provided similar graphs for sublimation too. References to these graphs have been added in the document where relevant. As the difference between linearly interpolated and statistically downscaled snow drift divergence is minimal, we have decided to show differences between linearly interpolated and higher-resolution results (Fig S2e-g) as these the subfigures then focus on the difference in modelled patterns, not on the inability of create these patterns by a downscaling technique.

R: Figure 7 caption: 'all data in this Figure is' should say 'all data in this Figure are'. Add information about the dashed lines/REF in the caption.

A: Thanks for spotting. As Figure 7 is the second plot with Taylor diagrams, adding this here would be a repeat of the caption of Figure 5. Nonetheless, we added at p12, L244: "Therefore, this point on the x-axis is has the label 'REF'."

R: Pg 17, Ln 320: in reference to figures, include that the \* markers are what the reader should be looking at here. Similarly, what on the Taylor diagram is showing that the 60km resolution is 'insufficient'.

A: In order to clarify this, the text is changed into: "The behavior of model performance as function of resolution and refinement technique is very different in the accumulation zone (Fig. 7b and d, stars). 60 km resolution is insufficient to estimate accumulation as the variability are overestimated (1.25 to 1.4 times observed variability, Fig. 7b) due to erroneous variability that is of the same magnitude as the observed variability."

R: Pg 18, Ln 357: Remove 'These waves may or may not be realistic' here as you say it later. A: Done

R: Pg 19, Ln 362: remove 'as already mentioned' if you change the above sentence. A: Done

R: Pg 19, Ln 376: Why do you exclude the first year?

A: We did this also for the reference runs. This has not been stated very clearly in the manuscript, this has been added to section 2.2: "Unless stated differently, the first year of the simulation is excluded to reduce the effect of firn layer spin-up on the modelled SMB." and the specific sentence in Sec. 3.5 is rewritten to "Similar to the reference simulations, the analysis below, the first year of all simulations is excluded."

R: Pg 19, Ln 381: Why do you exclude the first 4 years?

A: To analyse the effect of firn layer model spin-up. To make this more clear, then sentence has been changed into: "This spin-up effect lasts only for a few years, because if the first four years are discarded, hence excluding more vigorously firn spin-up effects, the SMB in the lower ablation zone (SMB  $\ll$ -2 m w.e.  $a^{-1}$ ) is comparable with the reference run (not shown)."

R: Pg 21, Ln 406: Where do these soot content values come from? Literature or observations perhaps

A: It is derived by tuning in earlier studies with RACMO2, and this should have been stated in the description of the model. It is added now in Section 2.2. "The reference soot concentration is set to 0.10 ppmv, equivalent to the default value in RACMO2.1 and RACMO2.3p1 (van Angelen et al., 2012; Noël et al., 2015)."

R: Section 3.5.5 is missing- or the subtitle is in the wrong place. It would make sense that this should go before Line 439, starting with 'Figure 10 shows: ::'

A: True, and corrected. This misplacement of the section header had slipped in while optimizing the figure placing in the discussion paper.

R: Pg 22, Ln 461: Whilst I agree that a smaller fraction of Greenland is being improved, aren't these some of the most important regions in terms of the SMB, such as the coast and low-elevation zones?

A: That is surely true but in our view not fully balancing the reduction of the "area of change". The sentence has been adjusted to: "The regions of improvement represent a progressively smaller fraction of Greenland, however these regions near the margin exhibit, for example, the highest ablation rates. Nevertheless, the impact of the improvements induced by grid refinement on the overall SMB likely decreases as well (Lang et al., 2015; Fettweis et al., 2017)."

R: Pg 24, Ln 481: treating is spelt wrong. A: corrected.

# **Reviewer 3:**

R: The authors present a thorough and systematic comparison of the performance of the RACMO2 regional climate model run over a South Greenland domain for a series of consecutively increasing resolutions (60, 20, 6.6 and 2.2 km). This is a very valuable undertaking and I cannot recall having seen this done for this or other models in this part of the world. This makes it particularly useful as a reference for other modeling groups and further experimental design. The authors also include a second half of the manuscript that aims to give context to the resolution-dependent results by testing the sensitivity of melt and SMB to changes in various physical parameterizations.

The manuscript is generally well-written and well-structured and deals with an interesting and important subject. It was a pleasure to read, although it did become a bit difficult and long to read at times (see detailed comments below). I have only two real concerns (see below) but I believe that the authors can address this with proper disclaimers. I therefore suggest to accept the manuscript with only minor revisions.

A: We thank the reviewer for the positive feedback. These proper disclaimers have been added, as discussed already extensively. Furthermore, by embedding the comments the manuscript became even longer, our apologies for that.

# **Major comments**

R: Normally, I would consider the 6.6 km run to be within the grey-zone for hydrostatic physics and the 2.2 km run should be expected to be well within the range where it could break down. The authors do comment on this (eg. L \_365), but concerns about running hydrostatic at 2.2 km should have a more prominent place, including in the abstract, introduction and model-setup section.

A: These disclaimers has been added at these points. As this rebuttal document is already length, we refer the reviewer to the attached track-changes manuscript to see the textual changes.

R: The second part of the study where certain physical parameterizations are experimented with is the weakest part of the paper. They do not follow naturally from the former part of the paper and do perhaps even blur a bit the picture from the first, very stringent and systematic half of the paper. Also, I am not convinced that the particular processes that are chosen for this set of sensitivity tests are adequately argued for. I gather that this part has been included to provide some sort of comparison of the magnitude of the resolution-change effects, but if that is the case then this comparison should be made explicitly.

A: We agree that the second part is less systematic than the first part. However, it is hard to make a complete and accurate list of possible model errors, and some tests, e.g. on changes in the precipitation scheme or turbulence scheme, could be cumbersome to implement. In order to make the intention of the second part clearer, we added on P19L373: "In order to estimate intrinsic error due parameterisation and model initialisation choices in comparison to the changes differences induced by model resolution, eight additional full ...". We did not change the wording in the introduction (P3L61-64), as we deem these sentences are clear on the aim of these sensitivity experiments.

# Minor comments/typos

R: L11: "almost as well". A: Adjusted

R: L36: "can the SMB be measured". A: Adjusted

L50: "type of statistical". A: Adjusted

L51: drop "do" before "correlate". A: Adjusted

L140: "coarse". A: Adjusted

L184: west of Tasiilaq? A: True, adjusted

R: Fig 3/4: Consider adding texts to the panels labeling them. That way the figure can almost be read without reading the caption.

#### A: Done as requested.

R: Fig 5 etc: Taylor Diagrams are tricky to read for the untrained and the authors do a pretty good job of explaining them. But they could help the reader even more along the way. Also, there are details within the cluster of symbols situated in the lower right corner of Fig 5b. I suggest to include a blow-up of this part of the figure to allow the details to be visible.

A: As Reviewer 2 requested something similar, we have made the references to graphs 5 and 7 more explicit. Furthermore, we added a blow-up of Figure 5b as Figure 5c. The result is not extremely graphically appealing, but it works good enough.

R: L269: drop "of" before "6.6". A: Done

R: Table 4: The caption says "downscaled" several times, but it does not say which resolution is downscaled to.

A: In Section 3.3 we use data downscaled to the locations of the observations, so the resolution of the downscaled product does not play a role as such a product is not used. To clarify this, we added in P14, L 284: "For this aim, model data is interpolated or downscaled to the specific location of each observation." And to the caption of Table 4: "...SMB to the location of the observation, respectively."

R: Caption to Fig 7, second line: "ablation (dots)" should this be "(circles)"? A: yes, adjusted.

R: Fig 7: For some reason, it took me a while to realize that the legend in the top right corner of panel b actually applies to all panels. Can it be placed differently to make this more obvious?

A: We kept the legend at the same place, but added to the caption (and the caption of Figure 5 in similar fashion): "The legend in b) right corner applies to all panels."

R: L386-388: Very complicated sentence.

A: The sentence is adjusted to: "This is partly due to the lower precipitation as less precipitation reduces the melt water buffering capacity of the firn layer for refreezing in Spring. Subsequently, less precipitation leads to an earlier surfacing of dark glacial ice during the ablation season."

R: L429: This over-compensation would only occur over ice where the Smeets and van den Broeke-formulation is used, right? Please make this clear.

A: No it is the other way around. In Andreas (1988), the flux-limiting character of stable boundaries is fully incorporated in decreasing values of  $z_{0h}$  and  $z_{0q}$ , while in Smeets and van den Broeke (2008b) the stability functions already do limit the fluxes for equal values of  $z_{0h}$  and  $z_{0q}$  In RACMO2, however, fluxes are strongly reduced in stable conditions by the atmospheric stability profiles, so decreasing  $z_{0h}$  and  $z_{0q}$  simultaneously would lead to double counting of the effect of the stable stratification on the fluxes. To make this more clear, we added "Hence,  $z_{0h}$  and  $z_{0q}$  are still partly stable boundary flow properties and not solely surface properties."

R: L438: Why is SMB reduced if melt is reduced?

A: This is indeed err, it is corrected to: "Along the margins of the ice sheet, snow melt is reduced and subsequently the SMB increases as the turbulent fluxes contribute less to removing the spring snow cover."

R: L451: What happended to the content of section 3.5.5?

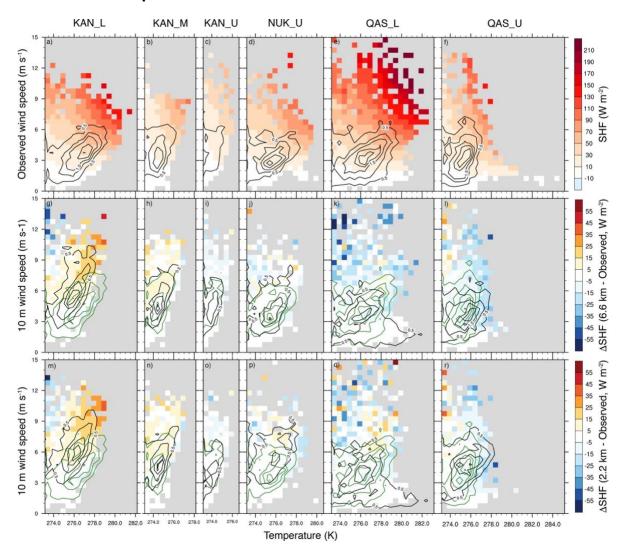
A: This section header ended up at the wrong place while typesetting the figures. It is corrected now.

R: L458: as->and. A: Adjusted R: L481: treating. A: Corrected

R: L501: I don't really understand the "thus" in this sentence. Do you rather mean "i.e."?

A: Yes, adjusted.

# Comparison of modelled SHF with AWS observations



**Figure R2:** Comparison of **(a-f)** the estimated SHF from observations and the difference between the estimated and modelled SHF from the **(g-I)** 6.6 km and **(m-r)** 2.2 km resolution simulation as function of the temperature (horizontal axis, K) and the wind speed (vertical axis, m s<sup>-1</sup>) at 6 Promice AWSs in South Greenland. As the wind observations are made at 3.1 m above the surface (in absence of snow cover), observed wind speeds are multiplied by a factor 1.25 to estimate 10 m wind speeds. Black contours in all panels show the point density (K-1 (m s<sup>-1</sup>)-1), multiplied by 100, for (a-f) the AWS observation and (g-r) model estimates. Green contours in panels (g-r) show the point density for the estimated observed 10 m wind speed.

# **Observations**

Observed hourly temperature and wind speeds observations and estimated SHF are downloaded from <a href="http://promice.org/PromiceDataPortal/">http://promice.org/PromiceDataPortal/</a>. The observed temperature and wind speeds are not corrected for deviations of sensor height from the reference heights of temperature (2 m) and wind (10 m) observations. As temperature observations are carried out, if snow cover is absent, at 2.6 m above the surface, these values are used as representative at 2 m. Wind observations are carried out 3.1 m above the surface, if snow is absent, therefore, these values are multiplied by a factor 1.25 to estimate 10 m wind speeds. This 1.25 is a modest estimate of the wind speed difference between these two levels for stable conditions. The estimated SHF values are taken from the dataset, these were derived using a surface roughness length of 0.001 m.

# **Comparison approach**

Data between either 1 October 2007 or the start of the observation data series, and 1 October 2014 are analyzed. Excluded are instances that DMI already discarded observations and if the obseved wind speed is exactly 0 m s<sup>-1</sup>. Data is subsampled to 3 hourly values, i.e. the data of 0, 3, ... 21 UTC is used, as RACMO2 data of

instantaneous temperature, wind and SHF values is stored on three-hourly resolution. In this manner, only RACMO2 is used for those moments that valid observations are available, excluding any potential sampling bias. For each AWS station, the data of the most proximate grid point is used and of one upslope or downslope grid point. The data is linearly interpolate between these two points to estimate observations at the exact elevation of the AWS station, excluding elevation induced temperature biases.

The stations NUK\_L, MIT and TAS\_L were excluded as such a grid point pair of glaciated model points was not available on both model resolutions, others were excluded as the time series was too short.

#### **Results**

Figure R2 shows the estimated SHF as function of the air temperature and wind speed. For the AWS observations (panels a-f), the values are uncorrected for any possible variations in observation height; for the other panels (g-r) SHF are gathered as function of 2 m temperature and 10 m wind speed. The figure focuses for melting conditions, as this analysis is carried out to analyze differences in the modelled ablation.

As mentioned in the manuscript, in the 2.2 km simulation SHF fluxes are higher than in the 6.6 km simulation. This is reflected in the point density plots of KAN\_L, NUK\_U, QAS\_L and QAS\_U, for which the 2.2 km models slightly higher probabilities for conditions with strong winds and high temperatures. For KAN\_M and KAN\_U, which are more inland, the point densities are near equal, and for these two sites the modelled point densities are rather similar to the observed point density. For NUK\_U, the 6.6 kilometer simulation is closer to observations, while for QAS\_L and QAS\_U the 2.2 km simulation is close to the observations. Striking is that both simulation model rather frequently an absence of the katabatic wind for QAS\_L, thus 2 m temperatures over 277 K while wind speeds are below 3 m s<sup>-1</sup>, which is in reality hardly observed. "Non-katabatic" melt events are modeled for and observed at QAS\_U, albeit less often than modelled for QAS\_L. Finally, the strength of the katabatic wind for melting conditions is overestimated by both resolutions for KAN\_L.

The modelled SHF agree generally well with the estimated SHF fluxes, with exception for KAN\_L, where fluxes are higher in RACMO2, and strong wind cases for QAS\_L and QAS\_U, for which RACMO2 estimates smaller SHF values than is estimated from AWS data. However, it should be noted that the estimated SHFs from AWS are no direct observations, hence the estimated values depend strongly on the choices made, for example, the used surface roughness length. As it not known if the values given lead to a closed surface energy balance, it is not clear whether these SHF estimates are correct, it is neither possible to conclude whether RACMO2 gives realistic estimates of the SHF or not. Direct observations of SHF are extremely sparse and, as far as we know, not available for the period for RACMO2 has been run for this study.

However, as the representation of the katabatic boundary layer for melting conditions in the 2.2 km simulation is not clearly better than in the 6.6 km simulation, we conclude that it cannot be proven that the SHF estimates of the 2.2 km simulation is likely better than the 6.6 km. This would have been plausible if the 2.2 km simulation has a clearly better representation of the boundary layer than the 6.6 km simulation.

The added value of high resolution in estimating the surface mass balance in southern Greenland

Willem Jan van de Berg<sup>1</sup>, Erik van Meijgaard<sup>2</sup>, and Lambertus H. van Ulft<sup>2</sup>

<sup>1</sup>IMAU, Utrecht University, Utrecht, The Netherlands

<sup>2</sup>KNMI, De Bilt, The Netherlands

Correspondence: W. J. van de Berg

w.j.vandeberg@uu.nl

**Abstract.** The polar version of the regional climate model RACMO2, version 2.3p1, is used to study the effect of model resolution on the simulated climate and surface mass balance (SMB) of South Greenland for the current climate (2007-2014). The model data on resolutions of 60, 20, 6.6 and 2.2 km are intercompared and compared to SMB observations using three different data refinement methods: nearest neighbour, bilinear interpolation and a statistical downscaling method utilising the local dependency of fields on elevation. Furthermore, it is estimated how the errors induced by model resolution compare to errors induced by the model physics and initialisation.

The results affirm earlier studies that SMB components which are tightly linked to elevation, like runoff, can be refined successfully, as soon as the ablation zone is reasonably well resembled resolved in the source dataset. Precipitation fields are also highly elevation dependent, but precipitation has no systematic correlation with elevation, which inhibits statistical downscaling to work well. If refined component-wise, 20 km resolution model simulations can reproduce the SMB ablation observations almost as good well as the finer resolution model simulations. Nonetheless, statistical downscaling and regional climate modelling are complementary, the best results are obtained when high resolution RACMO2 data are statistically refined. Model estimates in the accumulation zone do not benefit from statistical downscaling; hence, a resolution of about 25-20 km is sufficient to resolve the majority of the accumulation zone of the Greenland Ice Sheet with respect to the limited measurements we have.

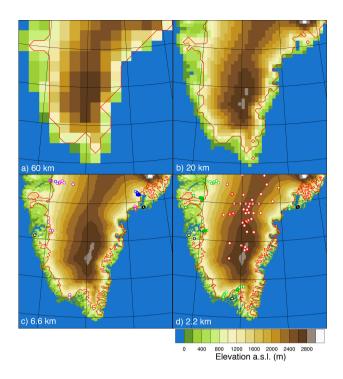
Furthermore, we demonstrate that using RACMO2, a hydrostatic model, at 2.2 km resolution lead to invalid results as topographic and synoptic vertical winds exceed 10 m/s, which violates the hydrostatic model assumptions.

Finally, additional tests show that model resolution is as important as properly resolving spatial albedo patterns, correctly initialising the firn column and uncertainties in the modelled precipitation and turbulent exchange.

#### 20 1 Introduction

15

The Greenland Ice Sheet (GrIS) is the second largest ice sheet on Earth and in the most recent years the GrIS was the largest single contributor to global sea level rise (Vaughan et al., 2013; van den Broeke et al., 2016). The GrIS mass loss is partly due to enhanced glacial ice discharge, but most of the mass loss acceleration is caused by enhanced ablation, i.e. runoff of melt



**Figure 1.** Model elevation and outline of glaciated areas (red) in the shared part of the domain for the 4 different model resolutions. In (c), locations of the excluded (black), single year (purplemagenta), summer (blue) time matched observations are drawn; In (d), locations of excluded (black) and multi-year ablation (green) and multi-year accumulation (red) observations are drawn.

water from snow and ice melt. It is projected that in the future, enhanced ablation will increasingly negatively impact the mass balance of the GrIS (e.g. van Angelen et al. (2013); Fettweis et al. (2013)).

Runoff and precipitation are the two primary components of the (climatological) surface mass balance (SMB), which includes internal accumulation by melt water refreezing or retention. Undisputedly, the SMB depends strongly on the local topography. Precipitation fluxes generally decrease with elevation and latitude as the amount of atmospheric moisture is much smaller at lower temperatures. However, where topography blocks the atmospheric flow, precipitation is enhanced instead. Runoff increases with decreasing elevation, but it is not solely depending on elevation as, for example, precipitation provides a negative feedback on runoff through enlarged meltwater refreezing capacity and mitigated response of the melt-albedo feedback (e.g. Noël et al. (2015)). It would be a good presumption that resolving the topography is a prerequisite to resolve the spatial patterns of the SMB, but this has not been proven yet. However, the topography of Greenland complicates the evaluation of such presumption. Most of the interior ice sheet is rather flat and homogeneous (Fig. 1), because ice sheets level out elevation differences. Along the margins of Greenland, in contrast, the topography is rough and mountainous and the ice sheet and its adjacent glaciers are no longer fully covering the surface. Here, the horizontal length scales of the topography are small, 1 km or even less. In these marginal zones, the largest spatial gradients in SMB are expected.

Several methods exist to estimate the SMB of the GrIS (van den Broeke et al., 2017). Unfortunately, only in dry snow areas where the annual layering is preserved without internal accumulation, i.e. refreezing of percolating meltwater, the SMB can can the SMB be measured by remote sensing. For that reason, ice sheet encompassing SMB estimates can thus only be derived with numerical models. Earth System Models have made significant progress in including the complex physical processes that govern the atmosphere-glaciated surface exchange of mass and energy (e.g. Vizcaíno et al. (2013); van Kampenhout et al. (2019)). However, current conventional computational budgets limit ESMs to resolutions of 0.5° or 1.0°, so South Greenland, for example, is resolved in comparable detail as shown in Figure 1a. To overcome this limitation it is common practice to use regional climate models (RCMs), i.e. dynamical downscaling, in analyzing the climate and SMB of the GrIS and typically resolutions at 20 to 5.5 km resolution are used (e.g. Noël et al. (2015, 2018); Fettweis et al. (2017); Langen et al. (2017)). The hydrostatic assumption used in these models inhibits a further refinement of the model grid, although some further refinement of the SMB can be archived by using fractional glacier masks (Fettweis et al., 2017). For simulations at higher resolutions non-hydrostatic (regional) models are required. This type of models, however, has been primarily developed for the purpose of weather forecasting in the mid-latitudes, so most of them yet lack the required detailed description of the relevant surface processes of glaciated surfaces. Nonetheless, non-hydrostatic models like WRF, NHM-SMAP and HARMONIE are increasingly applied for glaciated regions, e.g. Hines and Bromwich (2008); Mottram et al. (2017); Niwano et al. (2018); DuVivier and Cassano (2013), but due to their non-hydrostatic dynamical cores their computational costs are higher than hydrostatic models. Finally, SMB estimates up to the resolution of the latest digital elevation models (10 to 100 m) can be generated using statistical downscaling, as presented by Noël et al. (2016). For Greenland, a refinement to 1 km provided the best trade-off between data sizes and additionally resolved patterns. However, this type of statistical downscaling can only add value if the downscaled fields do correlate locally with topography.

With three available methods, i.e. ESMs, dynamical downscaling and statistical downscaling, the question arises which (combination of) approach(es) provides the best estimate of local and integrated SMB of the GrIS and its peripheral glaciers. Are RCMs still required for the best possible SMB estimates or could statistical downscaling of ESM derived SMB provide equally good estimates? Furthermore, if RCMs still provide added value, what is the optimal resolution? For example, could a grid refinement of RCMs to kilometre scales provide superior results compared to all currently available methods? Finally, can we estimate for which resolution the approximations in model parameterisations and model initialisation become a source of error as important as model resolution?

In order to answer these questions, the polar version of the hydrostatic RCM RACMO2, version 2.3p1 has been run for South Greenland at four different resolutions: 60, 20, 6.6 and 2.2 km. These simulations, with and without statistical downscaling are analysed and compared to ablation and accumulation observations. The simulation at 2.2 km has been performed to investigate to which extent violating the assumptions made in RACMO2, i.e. hydrostatic atmospheric flow and that convective motion must be fully parameterized, deteriorate the model results. The results presented here, therefore, provide by no means any justification to apply a hydrostatic model on resolutions below 5 km on operational basis. Furthermore, the effect of grid refining on the SMB is compared to the effect of parameter tuning and modelling choices. In this way, the performance of

statistical downscaling compared to dynamical downscaling can be assessed and the sources of uncertainty and errors can be determined, hence providing directions for further model development and research.

This manuscript starts with a description of RACMO2, some specific new parameterisations applied here and the observations used for evaluation. Next, the model results are analysed. First, statistical downscaling is applied to compare low-resolution RCM output with high resolution output, followed by a comparison of modelled data with observations. Then, we discuss the drivers of the differences in the model outcome for the highest resolution and finally, the sensitivity of model outcome to modelling and parameterisation choices is investigated. The manuscript is finalised with a discussion and conclusions.

# 2 Definitions, model, runs, statistical methods and observations

80 The climatological surface mass balance (SMB) is the local net mass gain or loss due to surface processes and internal accumulation, expressed in mm w.e. (water equivalents)  $a^{-1}$ . For this study, we take the following components into account:

$$SMB = Prp - SU - RU - ER_{ds}, \tag{1}$$

where Prp, SU, RU and ER<sub>ds</sub> are precipitation, sublimation including drifting snow sublimation, melt water runoff at the bottom of the snow pack and erosion due to transport of drifting snow, respectively. Precipitation is the primary mass source; SU, RU and ER<sub>ds</sub> are (predominantly) mass loss terms, for these three components positive values imply a mass loss.

# **2.1 RACMO2**

100

The polar version of the Regional Atmospheric Climate Model RACMO2 has been used for over a decade to investigate the climate and SMB of Greenland. In the model simulations presented here, version 2.3p1 is used, which consists of the hydrostatic dynamics of the RCM HIRLAM, version 5.0.6 (Undén et al., 2002) and the physics package of the ECMWF IFS model, version cy33r1 (ECWMF-IFS, 2008). Additionally, the polar version incorporates a multilayer snow model (Ettema et al., 2010), including grain size dependent albedo (Kuipers Munneke et al., 2011), and snow drift (Lenaerts et al., 2012), to represent the specific atmosphere-surface interactions on ice sheets. Melt water percolation is modelled using the bucket method; if ice lenses are modelled in the firn pack, these are treated as permeable. Noël et al. (2015) presents an evaluation of modelled climate and SMB of the Greenland Ice Sheet of model version 2.3p1.

The parameterization of convection in the IFS physics uses an adapted version of the model presented by Tiedtke (1989). This module is used for all simulations, also for the run at 2.2 km resolution. The choice has drawbacks, as the parametization of convective clouds can start competing with the explicitly resolved mesoscale convective systems, reducing the quality of the model results. However, it should be kept in mind that this 2.2 km is run and discussed to show that RACMO2 is unsuitable for this resolution, irrespective of the quality of the modelled SMB. Furthermore, convective precipitation is of limited importance for the SMB the GrIS, where convection is generally weak and limited to summertime.

**Table 1.** List of variables in Equations (3) and (4).

110

115

Symbol	Value	Unit	Description
ρ		${\rm kg}~{\rm m}^{-3}$	Snow density
$\rho_i$	900	${\rm kg}~{\rm m}^{-3}$	Density of ice
$\rho_s$	600	${\rm kg}~{\rm m}^{-3}$	Threshold density for fast snow compaction
$E_k$	$1.7 \cdot 10^4$	$\rm J~mol^{-1}$	Activation energy
$E_{c,A10}$	$\underbrace{4.24\cdot10^4}_{\bullet}$	$\rm J~mol^{-1}$	Activation energy
$k_{c,A10}$	$\begin{cases} 9.2 \cdot 10^{-9} & \rho \le 550 \text{ kg m}^{-3} \\ 3.7 \cdot 10^{-9} & \rho > 550 \text{ kg m}^{-3} \end{cases}$	${\rm kg}^{-1}~{\rm m}^3~{\rm s}^{-1}$	Compression constant
$k_c$	$2.45 \cdot 10^{-2}$	$Pa^{-1}$	Compression constant
$k_s$	$9.3 \cdot 10^{-4}$	$m^3 kg^{-1} Pa^{-1}$	Compaction constant
r		m	Effective grain size
R	8.314	$\rm J\;mol^{-1}\;K^{-1}$	Gas constant
$\sigma$		Pa	Overburden pressure
t		S	time
T		K	Snow temperature

Turbulent exchange of heat and moisture of the surface with the lowest model layer, which is at approximately 10 m, are parameterised using Monin-Obukhov similarity theory (Undén et al., 2002) (ECWMF-IFS, 2008). It assumes that, for neutral boundary layer conditions, the profiles of wind, dry static energy (heat) and specific humidity change logarithmically from their surface values to their values at the lowermost model level. The boundary layer is generally stable over glaciated surfaces, in that case the logarithmic profiles are corrected with stability profile functions of similar shape as proposed by Holtslag and de Bruin (1988). In case of unstable conditions, the flux profiles of Dyer and Hicks (1970) are used. The transition height from near-surface laminar flow to turbulent flow and the effectiveness of turbulent exchange depends, among other factors, on the surface roughness length. For glaciated surfaces, the roughness length for momentum  $(z_{0m})$  is set to 1 mm and 5 mm for snow covered and bare ice surfaces, respectively. The roughness length of heat  $(z_{0h})$  and moisture  $(z_{0q})$ , a constant value for all other land surface types, is defined by the parameterisations of Andreas (1987) and Smeets and van den Broeke (2008b) for snow covered and bare ice surfaces, respectively. In these two parameterisations represent the flux limiting effect of stratification on turbulent mixing while the surface drag (form drag) is less affected by stratification as it is also generated by the pressure fluctuations in the turbulent wake behind roughness elements (Smeets and van den Broeke, 2008b).

The reference polar version of RACMO2 employs the snow densification formulas as presented by Ligtenberg et al. (2011). These formulas, however, require precise *a priori* estimates of the local annual snowfall and temperature, which were not available prior to the simulations. Therefore, we described snow densification with the following empirical formulas: initially

explored an expression for creep of consolidated ice with cylindrical pores (Arthern et al., 2010, Eq. (B1)),

120 
$$\frac{\partial \rho}{\partial t} = k_{c, A10}(\rho_i - \rho) \exp\left[-\frac{E_k}{RT} \frac{E_{c, A10}}{RT}\right] \sigma \frac{1}{r^3} \frac{1}{r^2}.$$
 (2)

in which  $k(\rho)$  is defined as

125

$$\rho < \rho_s: \qquad k(\rho) = k_c(\rho_i - \rho) + k_s(\rho_s - \rho)^2$$
  
$$\rho \ge \rho_s: \qquad k(\rho) = k_c(\rho_i - \rho).$$

The variables used in these this and following Eqs. are listed in Table 1. However, we were unable to tune this relation to match the modelled firm densities with snow density profiles from Antarctica (van den Broeke, 2008). We chose to focus on Antarctic firm cores for tuning as in the Antarctic interior melt, which significantly alters the properties of firm cores and the densification process, is not occurring. Specifically, this equation fails to represent both the fast densification of low density, fine grained snow under very weak overburden pressure and the slower densification once the snow is denser and coarser grained while the overburden pressure is orders of magnitudes bigger. However, densification partly depends on the recrystallisation of snow, which leads to a net growth of the crystals. Therefore, we modified Eq. (2) to the following empirical formula

130 
$$\frac{\partial \rho}{\partial t} = k(\rho) \exp\left[-\frac{E_k}{RT}\right] \sigma \frac{1}{r^3} \frac{\partial r^3}{\partial t},$$
 (3)

in which  $k(\rho)$  is defined as

$$\rho < \rho_s: \qquad k(\rho) = k_c(\rho_i - \rho) + k_s(\rho_s - \rho)^2 
\rho \ge \rho_s: \qquad k(\rho) = k_c(\rho_i - \rho).$$
(4)

In Eq. (3),  $k(\rho) \exp\left[-E_k/RT\right]$  represents the strength of the snow structure;  $\sigma$  is the effective pressure applied on the snow and  $(1/r^3)(\partial r^3/\partial t)$  provides a rate of change within the snowscaled measure of recrystallisation rate. The modelled evolution of the snow grain size r includes dry and wet snow metamorphism and is discussed in Kuipers Munneke et al. (2011). Equations (3) and (4) were tuned using snow density profiles from Antarctica (van den Broeke, 2008) and are able to reproduce these density profiles almost as good as the model presented by Ligtenberg et al. (2011).

# 2.2 Model simulations

We performed simulations on four domains with resolutions of approximately 60, 20, 6.6 and 2.2 km, respectively. These four domains have a shared interior on which no boundary relaxation conditions were applied. This interior, on which we analyse the results, covers 900×900 km, thus 15×15 and 405×405 grid boxes for the coarsest and finest model resolutions, respectively. The shared interior and the topography as resolved by the models are shown in Figure 1. Around this interior, all domains include subsequently several rows of non-relaxed grid points surrounded by the boundary relaxation zone. Runs at the four resolutions were carried out with a time step of 150, 150, 150/90 and 60 s, respectively. For the 6.6 km simulation,

the smaller time step of 90 s was only used for months with high wind speeds which causes the Lagrangian advection scheme to fail at processor sub-domain boundaries. In the 2.2 km simulation, this problem was mitigated by extending the shared-data rim around sub-domains from 6 to 8 grid boxes. Simulations at all resolutions were carried out on the same vertical mesh with 40 model levels. The lowest model levels were at approximately 10, 30 and 90 m above the surface.

Simulations cover the period September 2006 to October 2014 and ECMWF Operational Analyses were used as boundary conditions. These boundaries and simulation period were chosen because Operational Analyses have a spatial resolution of 25 km (February 2006 to January 2010) and 16 km (February 2010 onwards) for this period, which allows to drive the 2.2 km RACMO2 run without intermediate RACMO2 simulation. Although this 11-fold grid refinement step is bigger than typically used for high-resolution studies, it was preferred here to a double-nesting approach, as the latter would inhibit comparing simulations covering similar domains. The runs have not been extended to more recent years as the last observations used here for evaluation (discussed below) were conducted in the summer of 2014.

Since no *a priori* outline is known of the modelled ablation, percolation and dry snow zone, we chose to use a uniform initialisation of the snow model. All runs were initialised with a fresh snow layer of 50 cm in order to have, without long spin up, good results in the ablation zone where perennial snow is absent. For the dry snow zone this initialisation is also deemed sufficient because it reproduces the thermal characteristics of a thick snow layer. However, in the percolation zone this relatively thin snow pack lacks refreezing capacity, especially if precipitation is low. This affects runoff estimates in the percolation zone as will be discussed later. Finally, a constant ice albedo of 0.42 – a typical bare ice albedo value for the GrIS – is used, instead of MODIS derived albedo as is used in Noël et al. (2015), in order to improve the comparability of the model results on various resolutions. The reference soot concentration is set to 0.10 ppmv, equivalent to the default value in RACMO2.3p1 (van Angelen et al., 2012; Noël et al., 2015).

Unless stated differently, the first year of the simulation is excluded to reduce the effect of firn layer spin-up on the modelled SMB.

#### 2.3 Refinement methods

150

160

165

170

175

Besides using RACMO2, which can be seen as using dynamical downscaling as refinement method, three methods to refine output were tested: nearest neighbour remapping, bilinear interpolation and a form of statistical downscaling. We tested both downscaling of the modelled SMB as well as a component-wise downscaling of the SMB components in Eq. (1). All methods are applied on time-averaged period-averaged accumulated quantities and not on daily accumulated SMB fields.

The SMB is only derived for ice sheet model grid points because outside this mask no valid estimates of SU, RU and  $ER_{ds}$  are provided. For nearest neighbour estimates, we assume that SU, RU and  $ER_{ds}$  are zero outside the ice sheet. For bilinearly interpolated estimates, modelled fields of SU, RU and  $ER_{ds}$  are extrapolated outside the ice sheet domain prior to interpolation. The extrapolation was done iteratively by assigning the average of eight surrounding grid boxes to unassigned grid boxes if at least three of these grid boxes have an assigned value.

Statistical downscaling from a host domain to a target domain uses the local dependency on topography (Noël et al., 2016). Unlike Noël et al. (2016), no subsequent adjustment step, in which local differences in the bare ice albedo of the course coarse

and high-resolution grid are used to minimize the mean SMB bias, has been carried out. Here, the downscaling is set up in the following manner: On every point on the host domain the local regression of a property (y) to elevation (h) is derived using the 8 surrounding grid points, thus  $y(h) = y_0 + hb$ . This regression is only calculated if 4 or more of these 9 grid points have valid data. For Prp, all grid points are valid; for SMB, SU and  $ER_{ds}$  only data points on the ice sheet are valid, and for RU, only ice sheet points with non-zero runoff are valid. Ice sheet points with zero RU are excluded, because otherwise the regression of RU to elevation would be underestimated. If the host point of interest has valid data,  $y_0$  is chosen in such a way that y(h) matches the modelled y at the elevation of the grid point, otherwise  $y_0$  is derived from the best fit. For RU, only negative values for b are accepted, i.e. runoff decreases with altitude, a positive b is set to zero. Next,  $y_0$  and b are extrapolated to host grid points for which no regression could be derived. Finally,  $y_0$  and b are bilinearly interpolated to the target grid, and refined estimates are derived using the local target elevation.

# 2.4 Observations

185

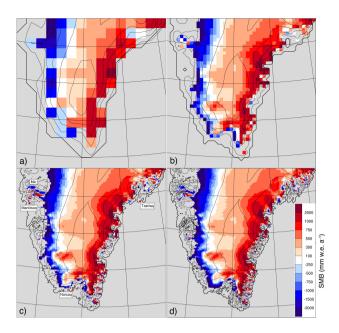
195

205

The modelled SMBs are compared with the ablation observations collected by Machguth et al. (2016b) and the accumulation observations presented by Bales et al. (2001, 2009). From the various data sets, only observations on the common model domain with known elevations were used.

The observations provided by Machguth et al. (2016b) are used in three ways, with within brackets the abbreviated name:

- 1. (Sub)-annual and time matched [Annual ablation]: Most of the ablation observations are precisely dated, so the ablation observations covering parts of the period between September 2006 and October 2014 are compared with model estimates for matching time periods. 128 observations at 40 sites fulfilled these criteria; 108 of them were annual ablation observations, one was accumulated ablation of 2 years and 19 were summer observations. These locations are shown in Figure 1c. The observations left out are on Mittivakket near Tasiilaq and Qasigiannguit glacier near Nuuk, both because the observations are too far away from glaciated points in the 6.6 and 2.2 km simulations.
- 2. Averaged and time matched [Period ablation]: In order to reduce the possible impact of misrepresented temporal variability, the 128 observations at those 40 sites were averaged into 40 annual SMB estimates. The model estimates are again derived using the time period covered by these averaged annual SMB estimates.
  - 3. Averaged [Average ablation]: Finally, as the short period for which RACMO2 is run excludes many observations, averaged modelled SMB for the October 2007 to September 2014 are compared to all available ablation observations, hence neglecting the interannual and decadal variability of SMB. For this purpose, separate records of ablation observations for a site were averaged into a single average per station, leading to 106 ablation estimates. Sites with only winter or summer balances were excluded. The locations of the multi-year mean ablation and accumulation observations are shown in Figure 1d. Observations within the model domain but well outside the ice sheet masks at one of the resolutions were also excluded. These observations are shown in Figure 1d as well.
- The accumulation observations, of which a considerable number was carried out well before 2006, are only used in the evaluation of the averaged modelled SMB for the full 7-year period from October 2007 to September 2014. Furthermore,



**Figure 2.** Annual mean SMB (mm w.e. a<sup>-1</sup>) for the period October 2008-2007 till September 2014 derived with RACMO2 with a resolution of (a) 60, (b) 20, (c) 6.6 and (d) 2.2 km, respectively. Grid points outside the ice sheet mask are grey. In c), Mic is used as abbreviation for the Maniitsoq ice cap.

accumulation observations with an elevation deviating more than 25 m from the Greenland Ice Mapping Project (GIMP, Howat et al. (2014)) elevation were excluded as such a big elevation deviation for sites at the flat interior ice sheet indicate a location error.

#### 215 3 Results

220

# 3.1 Modelled SMB on various resolutions

Not surprisingly, the main characteristics of the GrIS SMB (Figure 2) show up in all resolutions, i.e. high accumulation along the eastern coast and an ablation zone along the western margin. However, finer structures start to emerge with increasing resolution, for example, wavy patterns in the precipitation field across topographic promontories, the windward and leeward SMB patterns over Maniitsoq ice cap (north of Maniitsoq, Fig. Fig. 2(c)) and the narrow ablation zones in the southern tip and along the East coast of Greenland. The differences between the modelled SMB field derived on the 2.2 and 6.6 km resolved grid seem minor but are significant at some locations, for example, east west of Tasiilaq and north of Narsaq (Figure 2(c)).

The spatially integrated SMB for this part of Greenland varies with model resolution (Table 2). The low and medium resolution runs have an integrated SMB of about 70 Gt  $\rm a^{-1}$ , but the 2.2 km resolution run deviates with an integrated SMB of 47 Gt  $\rm a^{-1}$ . Apart from runoff, which slightly increases with resolution, however, no large change in the mean value of the

**Table 2.** Mean and spatial variability of the annual SMB and its components in the investigated region in South Greenland. All values are in mm w.e.  $a^{-1}$ . Additionally, spatially integrated mean SMB is given in Gt  $a^{-1}$ .

Resolution	Area	SMB		Prp	SU	RU	$ER_{ds}$
	$10^3 \text{ km}^2$	$\mathrm{Gt} \ \mathrm{a}^{-1}$	mean / std; mm w.e. $a^{-1}$				
60 km	317.1	64	203 / 911	836 / 825	34 / 30	598 / 863	1.1 / 4
20 km	316.3	75	237 / 956	848 / 877	47 / 40	562 / 889	1.2 / 8
6.6 km	318.4	71	223 / 1016	884 / 904	55 / 49	584 / 962	1.4 / 16
2.2 km	319.7	47	148 / 1056	836 / 872	54 / 53	633 / 1061	1.6 / 31

different SMB components is found. Precipitation is very rather similar for all resolutions, and although higher extremes are modelled for fine model resolutions, the standard deviation remains similar for all resolutions except for the 60 km resolution run. Up to 6.6 km resolution, the mean precipitation increases due to grid refining because resolving the topography induces that precipitation is concentrated on the ice sheet, which is higher than the surrounding areas, instead of around it. The decrease of mean precipitation for the 2.2 km resolution run will be discussed in detail in Section 3.4. Sublimation is more than one order of magnitude smaller than precipitation and runoff. Mass loss by sublimation increases with resolution; at low resolutions the high sublimation rates due to the katabatic outflow of cold and dry air are not well modelled (not shown). The export of snow from the ice sheet by snow drift divergence is negligible at all resolutions. However, regional transport of snow becomes increasingly important at finer resolutions as the standard deviation of local mass changes increases by a factor 2 for each threefold increase of model resolution.

# 3.2 Statistical downscaling versus dynamical downscaling

Before discussing the comparison of the modelled SMB with observations, we analyse to which extent the SMB and its contributing components can be sensibly refined. This analysis is done for all six possible simulation pairs; results are discussed in detail for the downscaling of 60 km data to 6.6 km only. We focus on precipitation and runoff, because these two processes largely determine the SMB.

# 3.2.1 Precipitation

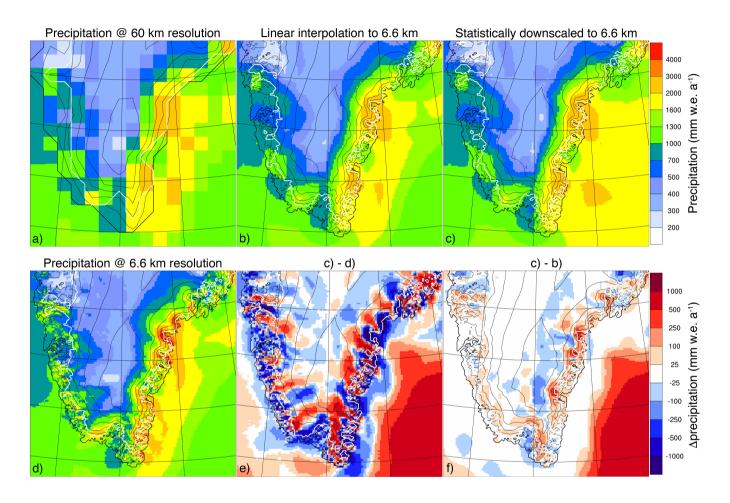
230

235

240

245

Figure 3 shows the results of refining precipitation fields from 60 to 6.6 km resolution. At 60 km resolution (Fig. 3a), the main characteristics of the precipitation distribution over Greenland are resolved. The eastern coast is wetter than the western coast; the higher interior is relatively dry and a precipitation shadow is located north of Sukkertoppen. Maniitsoq ice cap (Fig. 2(c)). As the model grids of 6.6 and 60 km align perfectly by design, the nearest-neighbour interpolated precipitation field equals Figure 3a. Bilinear interpolation of this field to 6.6 km resolution (Fig. 3b) gives a smoother representation of the latter but does not contain additional information. Although the precipitation might seem to depend on elevation, applying statistical downscaling



**Figure 3.** Results from refining precipitation from 60 km resolution to 6.6 km resolution. **a)** Modelled precipitation at 60 km resolution. **b)** Bilinear interpolated precipitation field. **c)** Statistically downscaled precipitation field using local regression to elevation. **d)** Modelled precipitation at 6.6 km resolution. **e)** Difference between statistically downscaled (c) and modelled (d) precipitation. **f)** Difference between statistically downscaled (c) and bilinear interpolated (b) precipitation. The white line mark the ice sheet margin.

gives very similar results (Fig. 3c), because the correlation between precipitation and elevation is weak where the variability in precipitation is highest. In general, statistical downscaling provides lower estimates for (relatively) high altitude locations and higher estimates for low altitude locations (Fig. 3f). Statistical downscaling also enhances the precipitation shadow north of SukkertoppenManiitsoq ice cap. As a side note, precipitation estimates over the ocean, well away from Greenland, and derived with statistical downscaling deviate strongly as they are extrapolated from coastal precipitation rates since the statistical downscaling procedures falls short away from Greenland in absence of topographic variations.

However, all refining methods fail to reproduce the modelled precipitation patterns at 6.6 km resolution (Fig. 3d). At this resolution, along-coast variability is modelled: the windward side of promontories face high precipitation rates, while the leeward side of these promontories are much drier. These patterns are not reconstructed at all by statistical downscaling and the differences between estimated (Fig. 3c) and modelled (Fig. 3d) are very substantial (Fig. 3e).

# 3.2.2 Runoff

250

255

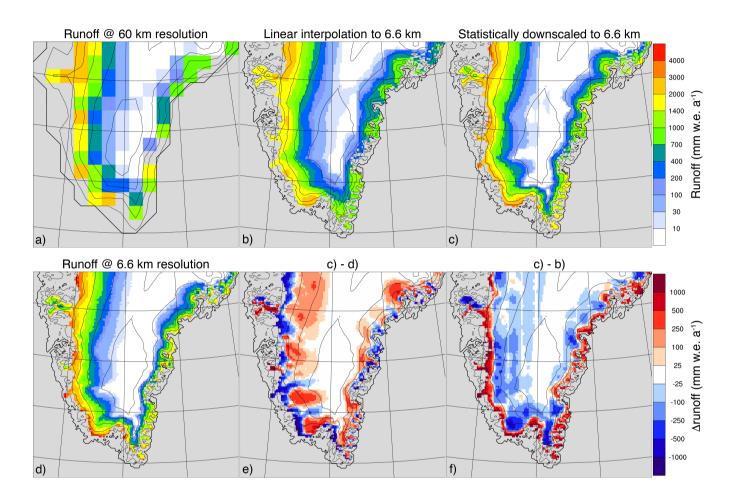
260

265

275

At 60 km resolution (Fig. 4a) a wide runoff zone is modelled for West Greenland and narrower zones for South and East Greenland. These zones are wider than modelled by Noël et al. (2015); 2006 - 2014 were relatively warm years. The additional runoff in the percolation zone is not buffered by refreezing since the firm layer had no time to build up in the simulations presented here. However, runoff estimates along the margins are robust since only winter snow is present every spring, hence the spin-up of the snow/ice pack is short. As for precipitation, a bilinear interpolation of the runoff fields to 6.6 km (Fig. 4b) is a smoothed version of the 60 km field. Note that no high runoff values are introduced along the margin. These higher runoff values are introduced if runoff is refined using statistical downscaling (Fig. 4c and f). At 60 km, maximum runoff estimates up to 2 m w.e. a<sup>-1</sup> are modelled, but with statistical downscaling the maximum runoff estimates increase to over 3 m w.e. a<sup>-1</sup>. Higher runoff estimates are also introduced along the southern and eastern margins of the GrIS. Away from the ice sheet margin, statistical downscaling reduces the runoff due to the concave ice sheet topography. Due to the north-south orientation of the ice sheet, this introduces a striped difference pattern between linearly and statistically downscaled runoff (Fig. 4f). Numerical artefacts arise near the divide of the GrIS (Fig. 4c). Here, the correlation of runoff to elevation decreases, leading to negligible but incorrect patterns.

Comparing the downscaled patterns with the modelled runoff at 6.6 km resolution (Fig. 4d), statistical downscaling improves the estimate brings the estimate closer to the 6.6 km resolution runoff field compared to the bilinear interpolation but still underestimates lacks the high runoff values along the ice sheet margin. These high runoff rates occur because at lower elevation, ice is increasingly exposed during the summer, more summer precipitation falls as rain eliminating the mitigating effect of precipitation on melt and warm tundra air can flow to some extent onto the ice sheet. All these processes are not modelled at 60 km resolution, hence the refined product fails to reproduce the large runoff gradient near the ice sheet margin. Nevertheless, statistical downscaling provides much better runoff estimates than bilinear interpolation of fields. Note that this difference is not due to variations in the ice albedo, as a constant albedo is used. In reality the albedo varies greatly from place to place.



**Figure 4.** As Figure 3, but now for Results from refining runoff from 60 km resolution to 6.6 km resolution. **a)** Modelled runoff at 60 km resolution. **b)** Bilinear interpolated runoff. **c)** Statistically downscaled runoff using local regression to elevation. **d)** Modelled runoff at 6.6 km resolution. **e)** Difference between statistically downscaled (c) and modelled (d) runoff. **f)** Difference between statistically downscaled (c) and bilinear interpolated (b) runoff.

**Table 3.** Root mean square differences (RMSD, mm w.e.  $a^{-1}$ ) of bilinear (bl) and statistically downscaled (sd) variables for all resolution combinations. SMBc denotes component-wise processed SMB.

Resolution Increase factor		SMB	SMBc	Prp	RU
		bl / sd	bl / sd	bl / sd	bl / sd
60 km to 20 km	3	487 / 429	472 / 404	306 / 296	345 / 185
20 km to 6.6 km	3	383 / 342	367 / 318	224 / 219	244 / 147
6.6 km to 2.2 km	3	297 / 286	288 / 270	163 / 169	190 / 144
60 km to 6.6 km	9	587 / 518	573 / 488	358 / 343	443 / 250
20 km to 2.2 km	9	481 / 436	461 / 413	254 / 256	342 / 234
60 km to 2.2 km	27	650 / 562	636 / 519	350 / 336	539 / 324

# 3.2.3 Statistical evaluation

280

285

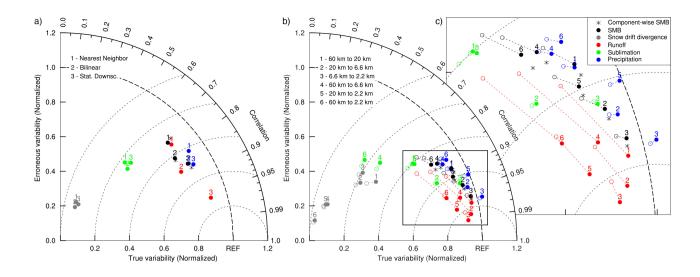
290

295

300

Analysis of the refining techniques using Taylor diagrams (Fig. 5) and the RMSD (Table 3) provides a quantitative assessment of the expected ability of different refining techniques to reproduce spatial SMB patterns. The horizontal axis in Figure 5 displays the fraction of the true high-resolution model variability that is captured by the low-resolution model, while the vertical axis displays the amount of erroneous variability contained in the low-resolution model results. If a dataset matches perfectly with the reference dataset — excluding systematic biases — the normalised true and erroneous variability are one and zero, respectively. Therefore, this point on the x-axis has the label 'REF'. A dataset with similar variability as the reference dataset will be drawn on the dashed circle, if the variability is underestimated points will be displayed closer to the (0,0) point. Figure 5a shows the reproduced variability of the SMB and its components for the three investigated techniques for refining from 60 to 6.6 km resolution. Crude nearest-neighbour interpolated fields are also assessed in this figure in order to quantify if bilinear interpolation is better than no efforts at all. For precipitation, bilinear interpolation removes spurious patterns since the amount of incorrect information reduces, but bilinear interpolation does not add true model signal. Statistical downscaling adds some true model signal and provides, therefore, a better estimate of the modelled fields at 6.6 km, but this improvement in the representation is small. For runoff, statistical downscaling provides the best estimate even though bilinear interpolation improves the also improves the representation of modelled runoff estimate. The statistical downscaling removes a significant amount of the incorrect deviations and adds a significant amount of true modelled variability. As a result, the refined runoff field correlates strongly with the modelled fields at 6.6 km resolution.

For the other SMB components, the results of the refinement are not as good as for runoff. The modelled sublimation patterns at 60 km resolution show far less absolute variability than the modelled sublimation at 6.6 km, and this variability is not added by statistical downscaling —(Fig. 5a, green dots; Fig. S1). Statistical downscaling of the sublimation modelled at 60 km does also not reduce the general underestimation of sublimation compared to the 6.6 km run (Table 2). Sublimation fields obtained



**Figure 5.** Taylor diagrams of the represented model variability for SMB and its components for **a**) various refining procedures from 60 to 6.6 km and **b**) bilinear (open circles) and statistical downscaling (filled circles) across all different model simulations, respectively, connected by dotted lines. Component-wise statistically downscaled SMB is shown with starse) Zoom of the boxed point cluster in **b**). The legend in **c**) applies to all panels. The horizontal location in the Taylor graph gives the fraction of the true variability reproduced by the model, the vertical location is the amount of erroneous variability as fraction of the standard deviation of the reference dataset.

with bilinear interpolation or statistical downscaling are thus qualitatively not much better than sublimation fields produced by crude nearest neighbour remapping. This is even more the case for snow drift divergence -(Fig. 5a, grey dots; Fig. S2). Patterns at 60 km resolution have significantly less variability than patterns at 6.6 km resolution and lack the ability to reproduce any of the patterns at 6.6 km resolution. Hence, refining makes thus little sense. However, since snow drift divergence is only a minor contribution to SMB, this has little impact on the ability to refine SMB.

305

310

315

Finally, SMB estimates improve the representation of high-resolution SMB estimates from low-resolution SMB estimates improves through application of statistical downscaling —(Fig. 5a). Component-wise statistical downscaling of SMB (black star adjacent to black dot #3) provides slightly better estimates of the SMB than statistical downscaling of the SMB itself (black dot #3). The differences are not large and enter through the constraints that are introduced in the refining step of individual components. For example, precipitation and runoff are both strictly positive, and precipitation is also modelled outside the ice sheet while runoff estimates are only derived on the ice sheet. The improvement of using component-wise statistical downscaling is likely larger if downscaling is applied on daily fields, when the local variations in precipitation and runoff are much more outspoken.

Figure 5b and Table 3 provides the results of refining all six possible resolution combinations. In Figure 5b, results of bilinear interpolation and statistical downscaling are shown with open and filled circles, respectively. In case of snow drift divergence (grey markers) statistical downscaling does not provide distinctly better results than bilinear interpolation. Moreover, the of 6.6 km resolution data is as different to 2.2 km data as the 60 km resolution data is different to the 20 km resolution data,

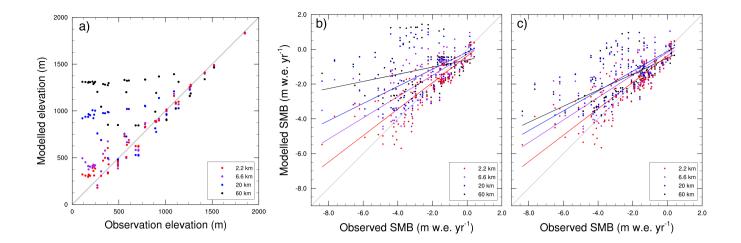
hence as points 1 to 3 cluster together. Hence there is no convergence in the spatial patterns modelled by RACMO2. Snow drift divergence is largely driven by topography, with erosion at and upwind of crests, and deposition downwind of these crests (not shownFig. S2). Hence, a consistent relation with topography is absent and the magnitude of erosion and deposition patterns increases with finer resolution as the topographic features become rougher. Nonetheless, erosion and deposition patterns over the interior ice sheet are almost equal in the 6.6 and 2.2 km resolution runs. The poor performance of statistical downscaling is due to the very different patterns modelled along the mountainous ice sheet margins in the south-east -(Fig. S2c, d and g). Statistical downscaling also hardly improves the sublimation estimates brings low-resolutions sublimation estimates (Fig. 5b, green markers) closer to high-resolution sublimation estimates compared to bilinear interpolation. However, the spatial pattern modelled at 6.6 km correlates well with the spatial patterns at 2.2 km (dot #3), so for sublimation a convergence to a definite spatial distribution starts to emerge—, even though the 2.2 km has consistently less sublimation over the interior of the ice sheet and higher sublimation near the ice sheet margins (Fig. S1c, d and g). A similar convergence is found for precipitation—and for downscaled and bilinearly interpolated runoff and SMB—In all (Fig. 5b). In all these cases, refined fields from 6.6 to 2.2 km (dots #3) are better than refined fields from 60 to 20 km (dots #1) with respect to resolved variability and remaining deviations (Table Tab. 3).

# 3.3 Evaluation against observations

In the preceding section, it is shown how and when statistical downscaling is expected to improve model results. In this section, we assess if statistical downscaling indeed increases the agreement with observations. For this aim, model data is interpolated or downscaled to the specific location of each observation.

First, model results are assessed using the "annual ablation" data, i.e. (sub)-annual, exactly time-matched ablation (Sec. 2.4). Table 4 shows that statistical downscaling, and especially component-wise statistical downscaling strongly improves low-resolution results. In more detail, the correlation of bilinearly interpolated SMB estimates from 60 and 20 km resolution runs is low and the regression slope is largely underestimated. As ablation is occurring along the GrIS edges, model data is basically extrapolated to this edge to obtain a model estimate when refining low resolution model data. As a result, the apparent observation elevations - which are interpolated in an equal manner as SMB - are strongly overestimated (Fig. 6a), leading to a considerable underestimation of the ablation rates (Fig. 6b). This error, due to a too coarse model topography, is already largely removed in the 6.6 km resolution results, and application of statistical downscaling does not further improve the estimated SMBs. Noteworthy, the modelled SMB from the 2.2 km run clearly provides superior ablation estimates. This will be analysed in more detail in section 3.4.

In Figures 7a and c, the results presented in Table 4 are graphically represented. Since a normal Taylor diagram (e.g. Fig. 7a) does not display systematic biases, Figure 7c has been added to include the contribution of the bias (horizontal axis) and the misrepresented variability (vertical axis) to the RMSD. In Figure 7a, the amount of misrepresented variability is the deviation of model results from the reference data (REF) and shown in the dotted circles around this 'REF'-point. Although RACMO2 overestimates the SMB (Fig. 6), the bias still is a smaller contribution to the RSMD than the misrepresented variability. Furthermore, the reduction in the bias owing to the increase in model resolution or the application of statistical downscaling is



**Figure 6.** Estimated versus **a)** true observational site elevation and **b, c)** observed SMB for all four model resolutions using **a, b)** bilinear interpolation and **c)** component wise statistical downscaling, respectively. Fits are derived using orthogonal regressions and the 1-to-1 line is drawn in grey for reference.

**Table 4.** Correlation, orthogonal regression slope, bias and RSMD for bilinear (bl), statistically downscaled (sd) and component-wise statistically downscaled (csd) SMB to the location of the observation, respectively.

resolution	r	regression slope	bias	RMSD	
	bl / sd / csd	bl / sd / csd	bl / sd / csd	bl / sd / csd	
			${\rm m~w.e.~a^{-1}}$	$m \text{ w.e. } a^{-1}$	
$60~\mathrm{km}$	0.19 / 0.43 / 0.57	0.21 / 0.50 / 0.46	1.31 / 1.01 / 0.80	2.30 / 1.94 / 1.65	
$20~\mathrm{km}$	0.40 / 0.55 / 0.62	0.49 / 0.55 / 0.57	1.07 / 0.97 / 0.93	2.02 / 1.78 / 1.66	
$6.6~\mathrm{km}$	0.63 / 0.62 / 0.62	0.61 / 0.66 / 0.65	0.67 / 0.67 / 0.68	1.53 / 1.55 / 1.56	
2.2 km	0.79 / 0.81 / 0.80	0.76 / 0.77 / 0.76	0.19 / 0.20 / 0.20	1.10 / 1.05 / 1.07	

larger than the decrease in the amount of missed variability (Fig. 7c). In both cases, high ablation locations are better resolved, which decreases the mean SMB and increases the variability. As the bias is relatively small for the best model results, the remaining source of error is the misrepresented variability in regional ablation. The contribution of misrepresented temporal variability is very small because the correlations and RMSDs of modelled SMB with the "period ablation" data, i.e. time aggregated "annual ablation" data, are very similar to the values shown in Table 4 for the "annual ablation" data (not shown).

355

360

If—When all available ablation observations are used, the resulting performance changes slightly (Circles in Fig. 7b and d). This difference arises from the improved spatial coverage of the ablation zones of South Greenland. Again, increasing the resolution as well as applying statistical downscaling both improve the results. Note that for 60 and 20 km model data component-wise statistical downscaling provides the best results, while for 6.6 and 2.2 km model data statistical downscaling

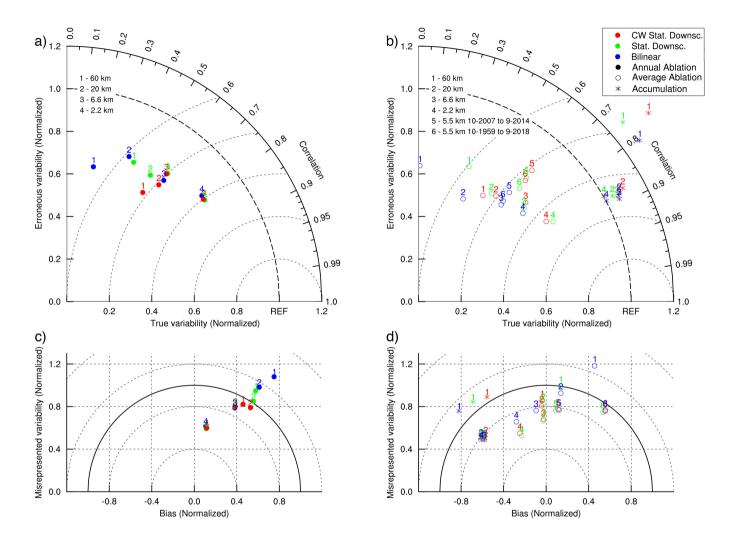


Figure 7. Graphical representation of the statistics of refined RACMO2 data for  $\mathbf{a}$ ,  $\mathbf{c}$ ) exact time-matching ablation observations,  $\mathbf{b}$ ,  $\mathbf{d}$ ) all ablation (dotscircles) and accumulation (stars) observations, respectively. Subfigures  $\mathbf{a}$ ,  $\mathbf{b}$ ) are Taylor diagrams; subfigures  $\mathbf{c}$ ,  $\mathbf{d}$ ) show the contribution of the bias (horizontal axis) and misrepresented variability (vertical axis) to the RMSD (circles around (0,0)). All data in this Figure is are scaled with the standard deviation of the observation dataset. The 5.5 km data is are taken from Noël et al. (2019). The legend in  $\mathbf{b}$ ), upper right corner, applies to all panels.

of the modelled SMB gives slightly better results. Since component-wise statistical downscaling of SMB should theoretically outperform statistical downscaling of the SMB itself, this outcome may indicate that for the modelled SMB at 6.6 and 2.2 km resolution model shortcomings become more important than lack of resolution. Furthermore, although the 2.2 km simulation provides the results with the lowest RSMD, ablation is now overestimated —as the bias has become negative (Fig. 7d). This overestimation could be due to the enhanced ablation in the most recent decades. The "average ablation" dataset includes many observations made between 1950 and 1980 when ablation was known to be less than in recent decades. In order to quantify the potential impact of this recent decrease in SMB on the bias, the "average ablation" dataset is also compared with modelled SMB of the RACMO2.3p2 simulation at 5.5 km (Noël et al., 2019) using both the full simulation length (1958-2018) and the specific time frame used here (2007-2014), showing that this temporal shift in SMB could be the same order of magnitude as the SMB biases of the statistically downscaled SMB estimates.

The behaviour behavior of model performance as function of resolution and refinement technique is very different in the accumulation zone (Fig. 7b and d, stars). 60 km resolution is insufficient to estimate accumulation as the gradients are overestimated, variability is overestimated (1.25 to 1.4 times observed variability, Fig. 7b) due to erroneous variability that is of the same magnitude as the observed variability. However, little to no gain in performance is seen between the 20, 6.6 and 2.2 km model results, and statistical downscaling has no added value, as the stars belonging to these resolutions are clustered in both panels. Of course, the possible impact of statistical downscaling was reduced by excluding observations with strongly deviating elevations. Furthermore, bilinear estimates are in most cases slightly better than statistically downscaled estimates. This result is in line with the earlier conclusion that statistical downscaling is not a suitable method for refining precipitation fields. We conclude that the quality of the modelled accumulation depends on the ability of the RCM or GCM to model precipitation patterns and that a resolution of about 20 km is enough to resolve the spatial patterns over the majority of the GrIS in South Greenland. Please note that in absence of observations, the modelled accumulation along the rugged southeastern margin of the GrIS cannot be evaluated.

# 3.4 Analysis of the 2.2 km run

365

380

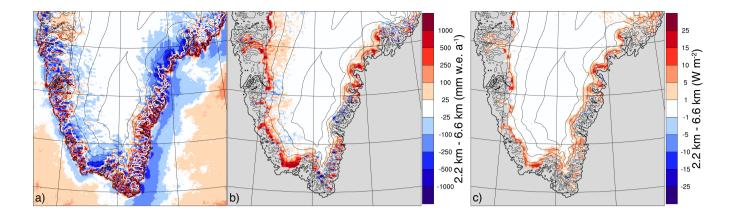
385

390

There are three linked causes for the improved performance of the modelled SMB at 2.2 km resolution. They are discussed by comparing model results obtained at 2.2 km and 6.6 km resolution.

Firstly, less precipitation is modelled at 2.2 km than at 6.6 km resolution for most of the margin of the GrIS (Fig. 8a). These Over the GrIS, these reductions are most outspoken West of Tasiilaq and North of Narsaq, where, by chance, also many of the ablation observations were located. In general, precipitation is reduced in the 2.2 km simulation compared to the 6.6 km simulation in coastal regions with relatively less rugged terrain. More precipitation is modelled over heavily rugged terrain and over sea at some distance from the coast. The differences are generally very small over the interior ice sheet, hence the performance representing the accumulation observations is similar.

The second and third cause are related to runoff as more runoff is modelled for the lower ablation zones (Fig. 8b). This is partly due to the lower precipitation as less precipitation reduces the melt water buffering capacity for refreezing and brings forward the moment of the firm layer for refreezing in spring. Subsequently, less precipitation leads to earlier surfacing of



**Figure 8.** Differences in the mean **a)** precipitation, **b)** runoff and **c)** sensible heat flux between the 2.2 and 6.6 km simulations. The sensible heat flux is positive if pointed towards the surface. The 6.6 km results are mapped on the 2.2 km grid using bilinear (a) and statistical downscaling (b, c), respectively.

395

400

405

410

dark glacial ice surfacingduring the ablation season. This results in similar patterns for precipitation and runoff. Runoff is further enhanced in the 2.2 km run by a higher sensible heat flux (SHF) towards the surface in the outer 20 km of the ice sheet (Fig. 8c). More detailed analysis (not shown) reveals that the higher SHF also occurs SHF is also increased during melt events, thus indeed enhances melt, and that both higher atmospheric temperatures and higher wind speeds contribute to the increase of SHF during melt events. Observations from automated weather stations (AWSs) point out that heat advection onto the ice sheet is a major driver of melt in the lower ablation zone, a process that and the contribution of the SHF to melt is often underestimated in (regional) climate models (Fausto et al., 2016). Thus, the modelled higher SHF fluxes near the margin are probably However, it cannot be proven that the higher SHF is more realistic. An equivalent analysis of the 6.6 km results with respect to the 20 km results (not shownFig. S3c) reveals a similar increase of SHF, however spread over a threefold wider zone and a lower magnitude to at most 10 W m<sup>-2</sup>. Since all model runs were performed with the same settings and similar time step lengths, the most probable reason for the increase of SHF is that a finer resolution allows for more dynamic heat advection onto the ice sheet at length scales up to ten times the grid resolution.

Such systematic differences in runoff and precipitation are absent when comparing the 6.6 km run with lower resolution runs —(Fig. S3). Of course, topography induced periodic patterns arise in the 6.6 km run (e.g. Fig. 3d), but no regional decreases or increases of precipitation and runoff are found. These patterns were also not expected given the similar error margins compared to observations (e.g. Fig. 7a).

Figure S4 displays the differences between the modelled large-scale and convective precipitation at 2.2, 6.6 and 20 km resolution. Over the GrIS, more than 90% of the precipitation is large-scale precipitation, and the precipitation differences over the GrIS (Fig. 8a) are predominantly due to changes in modelled large-scale precipitation (Fig. 4c). A plausible explanation for the changes in large-scale precipitation over land is that the regional precipitation patterns are caused by the flow patterns which arise by operating a hydrostatic model over rugged terrain while using resolutions as fine as 2.2 km. In the 2.2 km

run, standing 'supercritical flow'-like waves throughout the atmosphere are modelled fairly regularly over the mountainous coastal areas of South Greenland. These waves may or may not be realistic, but in all cases the patterns are stronger over the more rugged coastal mountains (southeastern coast) and tundra zone (southwestern coast) than over the ice sheet as ice sheets strongly dampen topographic gradients due to the diffusive nature of ice flow. The momentum of the related vertical motion up to  $10 \text{ m s}^{-1}$  is not conserved due to the applied hydrostatic assumption in RACMO2, which may lead to overestimated upward and downward motion. These waves induce (wet)-adiabatic cooling of air, subsequently extract humidity efficiently from the atmosphere through precipitation formation, which in turn leads to a reduction of available water vapour downstream and, therefore, to lower precipitation rates where topography favouring the generation of atmospheric waves is absent. As already mentioned, these These waves may or may not be realistic, but they will be better dealt with in a non-hydrostatic model.

Over sea, changes are due to different processes. Figure S4c shows that large-scale precipitation is rather uniformly reduced over the whole Atlantic sector in the model domain in the 2.2 km simulation. Similar reductions, however now for all ocean grid points, are visible between the 6.6 and 20 km simulation (Fig. S4e) and, to a lesser extent, between the 20 and 60 km simulation (not shown). No clear explanation nor reason has been found for this decrease. Away from the coast convective precipitation is enhanced in the 2.2 km simulation compared to the 6.6 km simulation (Fig. S4d). This enhanced convection is likely surface temperature driven, as this convective precipitation is not observed along the Greenland coast where sea surface temperatures are lower due to the East Greenland Current and seasonal sea ice. Given the importance of convective precipitation over the Atlantic Ocean, the validity of the model results is seriously affected by the choice to keep the parameterization of convection equal for all model resolutions. Even though convection in these cold, shallow tropospheric atmospheric conditions may remain on kilometre scales, thus at a similar scale as the 2.2 km model grid resolution, it is disputable at least whether the used approach for convection is right.

Concluding, RACMO2 run at 2.2 km resolution provides superior results for the lower ablation zone due to changing precipitation patterns. Yet, these results may be in part be caused by the limitations set by the hydrostatic assumption in RACMO2—and questionable choices for convection. Nonetheless. It also shows that on coarser resolutions precipitation is a source of error. Finally, the absence of similar precipitation patterns in the 6.6 km run, nor in the RACMO2.3p2 5.5 km run compared to the RACMO2.3p2 11 km run (Noël et al., 2018; Noël et al., 2019, not shown) indicates that RACMO2 can be applied at resolutions down to about 5 km. Concluding, non-hydrostatic models can not be used in polar regions at resolutions below 5 km, even if convection is suitable represented.

# 3.5 Sensitivity of model performance on parameterisation choices

425

430

435

440

445

In the preceding sections the impact of resolution and of data refinement on the model performance has been discussed. For a perfect model, insufficient resolution would be the only source of errors. RACMO2 is, as any other model, not perfect, so for a certain resolution the intrinsic model errors would become of larger importance than the errors induced by the limited model resolution. In order to estimate intrinsic error due parameterisation and model initialisation choices in comparison to the changes differences induced by model resolution, eight additional full period runs on the 20 km domain have been carried out

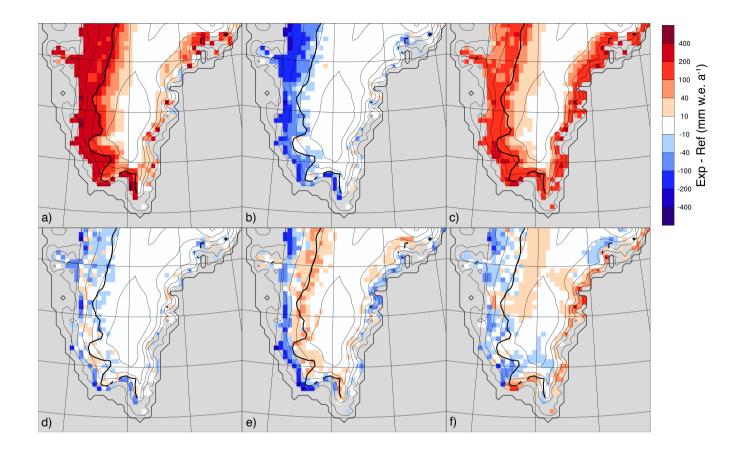


Figure 9. Difference in modelled SMB compared to the reference run from six of eight sensitivity test runs at 20 km resolution; October 2007 to September 2014 average: **a, run 1**) uniform 10 m firn layer, **b, run 4**) a reduced bare ice albedo by 0.04 to 0.38, **c, run 5**) the soot concentration in the snow halved to 0.05 ppmv, **d, run 6**) the roughness length of momentum of bare ice increased to 10 cm and **e, run 7**; **f, run 8**) equal roughness lengths of momentum, heat and moisture, with 1 cm over ice and (run 7) 1 mm or (run 8) 0.1 mm over snow, respectively. In all figures the equilibrium line in the reference run is drawn with a thick line for reference.

targeting four known possible sources of error: firn initialisation, snow densification, albedo and turbulent exchange of heat and moisture. In the Similar to the reference simulations, the analysis below, the first year of all simulations is excluded.

# 3.5.1 Firn initialisation

455

The reference runs at various resolutions were initialised with a spatially uniform fresh snow cover of 50 cm, leading to limited refreezing capacity in the accumulation zone. Figure 9a (run 1) shows the increase in SMB if was started with a spatially uniform layer of 10 m firn. A gradually increasing impact is visible from a small increase in SMB in the higher percolation zone up to 500 mm w.e. a<sup>-1</sup> higher SMB in the lower ablation zone. If This spin-up effect lasts only for a few years, because if the first four years are discarded, hence excluding more vigorously firn spin-up effects, the SMB in the lower ablation zone

(SMB  $\ll$  -2 m w.e.  $a^{-1}$ ) is comparable with the reference run (not shown). In the higher ablation and the percolation zones the SMB is still increased by up to 400 mm w.e.  $a^{-1}$ . The effect of initialising with an incorrect firm layer last longest close to the equilibrium line, which is also the region where the refreezing has also impact on the SMB.

These changes are not observed if the run is initialised with 3 m of firn (run 2, not shown); for this run the differences to the reference run are limited to about 20 mm w.e. a<sup>-1</sup>. Hence, 3 m firn initialisation does not affect melt in the ablation zone for periods beyond two years, which is a positive effect, however, it also does not provide the required refreezing capacity in the percolation zone, which is a negative effect. These runs show that in order to obtain accurate estimates of the SMB in both the percolation zone and the ablation zone, a proper initialisation of the firn/ice state is essential.

# 465 3.5.2 Firn compaction parameterisation

Next, a run is carried out using the densification parameterisation of Ligtenberg et al. (2011), fed with accumulation rates from the reference run. Using Ligtenberg et al. (2011) yields an increase in melt of 10 to 50 mm w.e.  $a^{-1}$  in the western ablation zone (run 3, not shown). This difference is due to the lower density of the winter snow, which reduces the ground heat flux in spring, allowing a slightly earlier onset of and subsequently stronger snow melt. Along the eastern coast, runoff is enhanced up to 150 mm w.e.  $a^{-1}$ . This enhancement is partly due to lower snow densities of near-surface snow and to faster compaction of the high-accumulation firn layer, leading to a reduction in pore space for water retention and, therefore, to higher runoff rates and lower SMB. Densification has thus a small but measurable impact on the SMB.

# 3.5.3 Albedo

485

Two runs were carried out to assess the impact of albedo on the SMB. In the first run (run 4), a uniform bare ice albedo of 0.38 is rather low but such values are observed in several regions of the ablation zone, especially where dust and algae accumulate (Noël et al., 2018). As expected, a lower ice albedo enhances melt and thus lowers the SMB up to 300 mm w.e. a<sup>-1</sup> (Fig. 9b). Note that the lower ablation zone, where the bare ice albedo influences SMB most, is underrepresented at this resolution, so the sensitivity of SMB to ice albedo is probably higher at finer resolutions. This experiment reaffirms that it is important to have an accurate estimate of the ice albedo.

In the second run (run 5), the soot content in snow is reduced from 0.10 to 0.05 ppmv, which has a similar but opposite effect on SMB (Fig. 9c) as the change in bare ice albedo. Less soot primarily increases snow albedo in winter and spring, which delays the onset of melt and snow metamorphism, reducing the melt and runoff in the percolation zone. In the ablation zone, lowering the soot concentration reduces runoff even more efficiently because when the onset of melt is delayed the moment of bare ice surfacing is delayed as well. Hence, runoff is most sensitive to the soot content in snow in regions with both high melt and high precipitation rates.

# 3.5.4 Turbulent exchange

490

495

500

505

510

515

Three runs were performed to examine the sensitivity of the SMB to the parameterisations of turbulent fluxes. Currently, RACMO2 uses a roughness length for momentum  $(z_{0m})$  of 1 mm over snow and 5 mm over bare ice and the roughness lengths for heat  $(z_{0h})$  and moisture  $(z_{0q})$  are determined using Andreas (1987) over snow and Smeets and van den Broeke (2008b) over bare ice. In run 6,  $z_{0m}$  over bare ice is increased to 10 cm, which represents a very rough terrain (Smeets and van den Broeke, 2008a). Although this is a 20-fold increase of  $z_{0m}$ , the effect on the modelled melt and thus on the SMB is limited (Fig. 9d). In the parameterisations of Andreas (1987) and Smeets and van den Broeke (2008b),  $z_{0h}$  and  $z_{0q}$  are decreasing functions of the roughness Reynolds number ( $R_{\star} \equiv u_{\star} z_{0}/\nu$ , with  $u_{\star}$  and  $\nu$  being the friction velocity and kinematic viscosity of air, respectively). Increasing  $z_{0m}$  increases the aerodynamic drag but also  $R_{\star}$ , which strongly reduces the increase of turbulent heat and moisture exchange for higher  $z_{0m}$ .

It should be noted that Andreas (1987) uses the assumption of a neutral boundary layer for his derivation of  $z_{0h}$  and  $z_{0q}$  and the subsequent heat and moisture fluxes over snow. The variations of  $z_{0h}$  and  $z_{0q}$  are thus not only a surface property but include flow properties as well, namely the limiting effect of the stable boundary layer on the turbulent fluxes. Smeets and van den Broeke (2008b) correct for the limiting effect of the stable boundary layer on the turbulent exchange, but they use relatively simple corrections (Pandolfo, 1966). Hence,  $z_{0h}$  and  $z_{0q}$  are still partly stable boundary flow properties and not solely surface properties. In RACMO2, however, the limiting effect of the stable boundary layer on the turbulent fluxes is already incorporated by using a modified version of the advanced gradient functions proposed by Holtslag and de Bruin (1988). Hence, using both turbulence-dependent values for  $z_{0h}$  and  $z_{0q}$  and complex stability functions could lead to over-compensating the limiting effect of a stable boundary layer on the turbulent fluxes.

Therefore, two experiments were performed in which  $z_{0h}$  and  $z_{0q}$  were kept equal to  $z_{0m}$ . In run 7 (Fig. 9e)  $z_{0m}$  was set to 1 and 10 mm over snow and ice, respectively. In this run the turbulent exchange is more efficient; the difference with the reference run is most prominent in the lower ablation zone where warm air reaches over the ice sheet. The enhancement of runoff in the ablation zone is larger than in the preceding sensitivity run (Fig. 9d) in which  $z_{0m}$  over ice was increased to extreme values. Near the equilibrium line, the run shows that enhanced turbulent exchange generally results in reducing the melt and hence increasing the SMB. Finally, as we didn't aim to enhance exchange over snow, a run was executed in which  $z_{0m}$  was set to 0.1 and 10 mm over snow and ice, respectively (run 8, Fig. 9f). In run 8, the turbulent exchange reduces slightly over snow, generally leading to more melt, compared to run 7, in the percolation zone. Along the margins of the ice sheet, snow melt is reduced and subsequently the SMB is reduced increases as the turbulent fluxes contribute less to removing the spring snow cover.

# 3.5.5 Sensitivity test runs evaluation

Figure 10 shows whether the set of test runs improve or deteriorate the comparison with observations. In many cases the differences with the reference run in predicting performance are very small, as the differences in modelled SMB are not large either. Including a firn layer, decreasing the soot content or fixing the roughness lengths (runs 1, 5 and 7) decrease runoff in

the percolation zone, reducing the bias and amount of misrepresented variability in the accumulation zone (Fig. 1, red dots). However, the subsequent reduction of melt in the ablation zone in runs 1 and 5 decreases the performance in representing ablation (Fig. 1, magenta, blue and green dots). All other test runs have little impact on the accumulation zone and subsequently exhibit similar performance in representing the accumulation observations. Lowering the bare ice albedo (run 4) does change the bias in the ablation zone, however, the correlation of the model results with the observations does not increase. This test run shows, thus, that it is imperative to have an accurate spatial and temporal description of ice albedo as moderate changes (e.g. 0.04) have already a significant effect on the local SMB. The only change that generally improves the results is using constant  $z_{0h}$  and  $z_{0q}$  (run 7). This test run increases the gradient in the ablation zone, which is underestimated in all other test runs (Fig. 6c).

# 3.5.6 Sensitivity test runs evaluation

# 4 Discussion

530

535

540

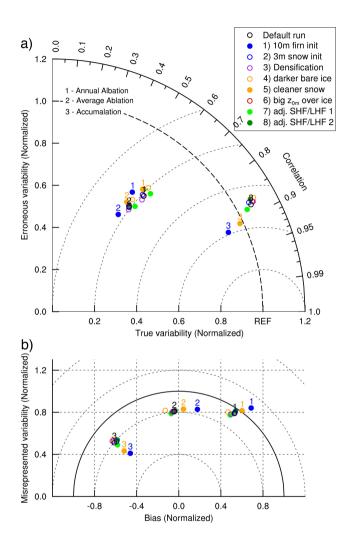
545

550

This research, firstly, aims to find the optimal resolution at which global or regional atmospheric models must be run in order to produce realistic SMB estimates; secondly, to which extent statistical downscaling can replace full model simulations and, thirdly, which physical processes represent the largest sources of error in final SMB estimates.

Simulations performed at various resolutions indicate that high resolution dynamical downscaling, i.e. running an RCM, in combination with further refining through application of statistical downscaling, in principle provides the best estimate of the SMB in both the accumulation zone of southern GrIS as and the ablation zone. Nevertheless, the results show that the performance gain by increasing the resolution flattens out. A resolution of 20 km is sufficient to resolve the accumulation zone of the GrIS; 6.6 km resolution is sufficient to resolve most of the ablation zone, and at 2.2 km almost all details of the GrIS and the larger peripheral glaciers are resolved. The regions of improvement represent a progressively smaller fraction of Greenland, so that the however these regions near the margin exhibit, for example, the highest ablation rates. Nevertheless, the impact of the improvements induced by grid refinement on the overall SMB likely decreases as well (Lang et al., 2015; Fettweis et al., 2017). An exception could be the instance that the overall model behaviour changes due to increased model resolution. The runs at various resolutions and the accompanying methods of interpolation show that statistical downscaling only improves runoff estimates significantly; for all other SMB components the beneficial impact is marginal. As runoff is the dominating SMB component in the ablation zone, statistical downscaling does improve SMB estimates in such regions, especially if all components are refined separately. However, statistical downscaling cannot fully replace high-resolution dynamical downscaling simulations. Additionally, fractional glacier ice masks, which are not tested in this research, have shown to improve statistical downscaling as this approach provides also estimates of SMB components outside the glaciated domain.

The simulation at 2.2 km resolution also clearly show that the hydrostatic assumption in RACMO2 sets a lower mesh limit of about 5 km below which model results are no longer physically correct. Ironically, the regional shifts in precipitation patterns induced by the vertical air motion over topography lead to the best estimates of SMB. It also shows that changes in



**Figure 10.** Sensitivity of the comparison of modelled SMB to observations as a function of snow initialisation, tuning and specific parameterisations, all derived using the 20 km resolution domain expressed by **a**) a Taylor diagram and **b**) RMSD contribution diagram like Fig. 7b and d.

the precipitation flux in the ablation zone counts double as more snowfall increases the buffering capacity for refreezing and shortens the time that dark glacial ice is exposed at the surface.

Although we did not carry out further sensitivity tests with a direct focus on precipitation or clouds, processes involving these parameters can be significant sources of error in the modelled climate and subsequent SMB. Modelled precipitation patterns are harder to tune than ablation as local precipitation is the result of the interplay between the large-scale circulation and cloud microphysics. Noël et al. (2018) demonstrate that retuning the microphysics parameters in the cloud scheme of RACMO2 can change the ratio between the precipitation deposited inland and along the coast. Besides that, the microphysics currently used in RACMO2 is effectively not treating cloud water and cloud ice as separate prognostic variables; subsequently, for example, it underestimates the occurrence of cloud water over the ice sheet (Van Tricht et al., 2016). Furthermore, RACMO2 has no horizontal advection of hydrometeors, which leads to too pronounced precipitation maxima on the windward side of topography (Lenaerts et al., 2017; Agosta et al., 2019).

The sensitivity tests show that for optimal estimates a proper firn initialisation and spatially variable - and ideally also time varying - glacial ice albedos are essential; both are not used here. Remote sensing provides detailed estimates of the glacial ice albedo, however, there is not yet an established method to estimate the bare ice albedo and its evolution. Such a parameterisation will be very beneficial for simulations of past and future climate. Proper firn initialisations can be made using dedicated firn densification models; *a priori* knowledge of the location of the equilibrium line can be included if an initialisation for the present-day climate is prepared. However, even if those efforts are done, refreezing is most uncertain in the vicinity of the equilibrium line, where the refreezing capacity directly influences the SMB: the time in which a firn column adjusts is longest and the melt water percolation processes - ice lenses or aquifer formation - are very complex (Forster et al., 2013; Machguth et al., 2016a).

Compared to the impact of precipitation, firn initialisation and albedo, the impact of the parameterisation of the turbulent fluxes on the SMB is relatively small. Nonetheless, further research on the parameterisation of the turbulent fluxes is required, as our tests show that melt rates at the margins can be quite sensitive to parameterisation choices. Neither the default surface roughness parametersation in RACMO nor the alternatively tested versions are to yield the best estimates of the turbulent fluxes. In order to make progress in the formulation of turbulent exchange under conditions of strong turbulent-driven melt dedicated flux measurements are required.

#### 5 Conclusions

555

560

565

570

580

Concluding, the results show that with a dynamical model, thus i.e. an ESM, GCM or RCM, run at a resolution of  $20 \, \mathrm{km}$  ( $\sim 0.25 \, \mathrm{^{\circ}}$ ) and subsequent statistical downscaling, reasonably good results for both the accumulation and ablation zone are obtained. An exception might be the rugged coastal accumulation zone of southeast Greenland where accumulation observations are missing. Yet, running a dynamical model at a higher resolution and subsequently applying statistical downscaling, leads to better results. In case of RACMO2, the best results are achieved with the  $2.2 \, \mathrm{km}$  simulation; a resolution, however, at which the hydrostatic assumption of RACMO2 is no longer valid. At this resolution local enhancement or reduction of precipitation formation due to

topographically induced vertical motion is no longer negligible. Nonetheless, the modelled significant vertical motions at this resolution lead to better matching spatial precipitation patterns. Additional sensitivity tests show that using higher resolution is only one aspect in further improving the estimated SMB. Of approximately similar importance are a) a proper initialisation of the firn layer in the accumulation zone, b) the representation of the spatial and temporal variation of the albedo of glacial ice, c) correct estimates of the turbulent fluxes during melting events and d) the representation of the local and regional precipitation patterns. Only once all these aspects are properly resolved in a well balanced manner, the uncertainty and error in the modelled SMB of the GrIS can be further reduced.

*Data availability.* The main datasets presented in this study can be downloaded from https://doi.org/10.5281/zenodo.3568129. Additional data sets are available from the authors upon request and without conditions

Author contributions. WJB prepared the manuscript, conducted the RACMO2 simulations and analysed the data. EVM and LHU provided assistance in setting up the simulations. All authors commented the manuscript.

Competing interests. The authors declare no competing interests.

Acknowledgements. Acknowledgement is made for the use of ECMWF's computing and archive facilities in this research. Horst Machguth is thanked for collecting and freely sharing his very relevant ablation observation dataset.

# References

615

- Agosta, C., Amory, C., Kittel, C., Orsi, A., Favier, V., Gallée, H., van den Broeke, M. R., Lenaerts, J. T. M., van Wessem, J. M., van de Berg, W. J., and Fettweis, X.: Estimation of the Antarctic surface mass balance using the regional climate model MAR (1979–2015) and identification of dominant processes, The Cryosphere, 13, 281–296, https://doi.org/10.5194/tc-13-281-2019, https://www.the-cryosphere.net/13/281/2019/, 2019.
- Andreas, E. L.: A theory for the scalar roughness and the scalar transfer coefficients over snow and sea ice, Boundary-Layer Meteorology, 38, 159–184, 1987.
  - Arthern, R. J., Vaughan, D. G., Rankin, A. M., Mulvaney, R., and Thomas, E. R.: In situ measurements of Antarctic snow compaction compared with predictions of models, Journal of Geophysical Research, 115, 2010.
  - Bales, R. C., McConnell, J. R., Mosley-Thompson, E., and Csatho, B.: Accumulation over the Greenland ice sheet from historical and recent records, Journal of Geophysical Research, 106, 33 813–33 825, 2001.
- Bales, R. C., Guo, Q., Shen, D., McConnell, J. R., Du, G., Burkhart, J. F., Spikes, V. B., Hanna, E., and Cappelen, J.: Annual accumulation for Greenland updated using ice core data developed during 2000-2006 and analysis of daily coastal meteorological data, Journal of Geophysical Research, 114, doi:10.1029/2008JD011 208, 2009.
  - DuVivier, A. K. and Cassano, J. J.: Evaluation of WRF Model Resolution on Simulated Mesoscale Winds and Surface Fluxes near Greenland, Monthly Weather Review, 141, 941–963, https://doi.org/10.1175/MWR-D-12-00091.1, https://doi.org/10.1175/MWR-D-12-00091.1, 2013.
  - Dyer, A. J. and Hicks, B. B.: Flux-gradient relationships in the constant flux layer, Quarterly Journal of the Royal Meteorological Society, 96, 715–721, 1970.
  - ECWMF-IFS: Part IV: Physical Processes (CY33R1), Tech. rep., European Centre For Medium-Range Weather Forecasts (ECMWF), http://www.ecmwf.int/research/ifsdocs/CY33r1/PHYSICS/IFSPart4.pdf, 2008.
- 620 Ettema, J., van den Broeke, M. R., van Meijgaard, E., van de Berg, W. J., E., J., and Steffen, K.: Climate of the Greenland ice sheet using a high-resolution climate model, Part 1: Evaluation, The Cryosphere, 4, 511–527, 2010.
  - Fausto, R. S., van As, D., Box, J. E., Colgan, W., Langen, P. L., and Mottram, R. H.: The implication of nonradiative energy fluxes dominating Greenland ice sheet exceptional ablation area surface melt in 2012, Geophysical Research Letters, 43, 2649–2658, doi:10.1002/2016GL067720, 2016.
- Fettweis, X., Franco, B., Tedesco, M., van Angelen, J. H., Lenaerts, J. T. M., van den Broeke, M. R., and Gallée, H.: Estimating the Greenland ice sheet surface mass balance contribution to future sea level rise using the regional atmospheric climate model MAR, The Cryosphere, 7, 469–489, 2013.
  - Fettweis, X., Box, J. E., Agosta, C., Kittel, C., Lang, C., van As, D., Machguth, H., and Gallée, H.: Reconstructions of the 1900–2015 Greenland ice sheet surface mass balance using the regional climate MAR model, The Cryosphere, 11, 1015–1033, 2017.
- Forster, R. R., Box, J. E., van den Broeke, M. R., Miège, C., Burgess, E. W., van Angelen, J. H., Lenaerts, J. T. M., Koenig, L. S., Paden, J., Lewis, C., Gogineni, S. P., Leuschen, C., and McConnell, J. R.: Extensive liquid meltwater storage in firn within the Greenland ice sheet, Nature Geoscience, 7, 95–98, doi:10.1038/ngeo2043, 2013.
  - Hines, K. M. and Bromwich, D. H.: Development and Testing of Polar Weather Research and Forecasting (WRF) Model. Part I: Greenland Ice Sheet Meteorology\*, Monthly Weather Review, 136, 1971–1989, https://doi.org/10.1175/2007MWR2112.1, http://dx.doi.org/10.1175/2007MWR2112.1, 2008.

- Holtslag, A. A. M. and de Bruin, H. A. R.: Applied Modeling of the Nighttime Surface Energy Balance over Land, Journal of Applied Meteorology, 27, 689–704, 1988.
- Howat, I. M., Negrete, A., and Smith, B. E.: The Greenland Ice Mapping Project (GIMP) land classification and surface elevation data sets, The Cryosphere, 8, 1509–1518, 2014.
- Kuipers Munneke, P., van den Broeke, M. R., Lenaerts, J. T. M., Flanner, M. G., Gardner, A. S., and van de Berg, W. J.: A new albedo parameterization for use in climate models over the Antarctic ice sheet, Journal of Geophysical Research, 116, doi:10.1029/2010JD015 113, 2011.
  - Lang, C., Fettweis, X., and Erpicum, M.: Stable climate and surface mass balance in Svalbard over 1979–2013 despite the Arctic warming, The Cryosphere, 9, 83–101, doi:10.5194/tc-9-83-2015, 2015.
- Langen, P. L., Fausto, R. S., Vandecrux, B., Mottram, R. H., and Box, J. E.: Liquid Water Flow and Retention on the Greenland Ice Sheet in the Regional Climate Model HIRHAM5: Local and Large-Scale Impacts, Front. Earth Sci., 4, doi:10.3389/feart.2016.00110, 2017.
  - Lenaerts, J. T. M., van den Broeke, M. R., Déry, S. J., van Meijgaard, E., van de Berg, W. J., Palm, S. P., and Rodrigo, J. S.: Modeling drifting snow in Antarctica with a regional climate model: 1. Methods and model evaluation, Journal of Geophysical Research, 117, doi:10.1029/2011JD016145, 2012.
- Lenaerts, J. T. M., Ligtenberg, S. R. M., Medley, B., van de Berg, W. J., Konrad, H., Nicolas, J. P., van Wessem, J. M., Trusel, L. D., Mulvaney, R., Tuckwell, R. J., Hogg, A. E., and Thomas, E. R.: Climate and surface mass balance of coastal West Antarctica resolved by regional climate modelling, Annals of Glaciology, 59, 29–41. doi:10.1017/aog.2017.42, 2017.
  - Ligtenberg, S. R. M., Helsen, M. M., and van den Broeke, M. R.: An improved semi-empirical model for the densification of Antarctic firn, The Cryosphere, 2011.
- Machguth, H., MacFerrin, M., van As, D., Box, J. E., Charalampidis, C., Colgan, W., Fausto, R. S., Meijer, H. A. J., Mosley-Thompson, E., and van de Wal, R. S. W.: Greenland meltwater storage in firn limited by near-surface ice formation, Nature Climate Change, 6, 390–395, doi: 10.1038/NCLIMATE2899, 2016a.
  - Machguth, H., Thomsen, H. H., Weidick, A., Ahlstrøm, A. P., Abermann, J., Andersen, M. L., Andersen, S. B., Bjørk, A. A., Box, J. E., Braithwaite, R. J., Bøggild, C. E., Citterio, M., Clement, P., Colgan, W., Fausto, R. S., Gleie, K., Gubler, S., Hasholt, B., Hynek, B.,
- Knudsen, N. T., Larsen, S. H., Merild, S. H., Oerlemans, J., Oerter, H., Olesen, O. B., Smeets, C. J. P. P., Steffen, K., Stober, M., Sugiyama, S., van As, D., van den Broeke, M. R., and van de Wal, R. S. W.: Greenland surface mass-balance observations from the ice-sheet ablation area and local glaciers, Journal of Glaciology, 62, 861–887, doi: 10.1017/jog.2016.75, 2016b.

- Mottram, R., Nielsen, K. P., Gleeson, E., and Yang, X.: Modelling Glaciers in the HARMONIE-AROME NWP model, Advances in Science and Research, 14, 323–334, https://doi.org/10.5194/asr-14-323-2017, https://www.adv-sci-res.net/14/323/2017/, 2017.
- Niwano, M., Aoki, T., Hashimoto, A., Matoba, S., Yamaguchi, S., Tanikawa, T., Fujita, K., Tsushima, A., Iizuka, Y., Shimada, R., and Hori, M.: NHM–SMAP: spatially and temporally high-resolution nonhydrostatic atmospheric model coupled with detailed snow process model for Greenland Ice Sheet, The Cryosphere, 12, 635–655, https://doi.org/10.5194/tc-12-635-2018, https://www.the-cryosphere.net/12/635/2018/, 2018.
- Noël, B., van de Berg, W. J., Lhermitte, S., and van den Broeke, M. R.: Rapid ablation zone expansion amplifies north Greenland mass loss, Science Advances, 5, eaaw0123, https://doi.org/10.1126/sciadv.aaw0123, http://advances.sciencemag.org/content/5/9/eaaw0123.abstract, 2019.

- Noël, B. P. Y., van de Berg, W. J., van Meijgaard, E., Munneke, P. K., van de Wal, R. S. W., and van den Broeke, M. R.: Summer snowfall on the Greenland Ice Sheet: a study with the updated regional climate model RACMO2.3, The Cryosphere, 9, 1177–1208, 2015.
- Noël, B. P. Y., van de Berg, W. J., Machguth, H., Lhermitte, S., Howat, I. M., Fettweis, X., and van den Broeke, M. R.: A daily, 1km resolution data set of downscaled Greenland ice sheet surface mass balance (1958–2015), The Cryosphere, 10, 2361–2377, 2016.

680

695

- Noël, B. P. Y., van de Berg, W. J., van Wessem, J. M., van Meijgaard, E., van As, D., Lenaerts, J. T. M., Lhermitte, S., Kuipers Munneke, P., Smeets, C. J. P. P., van Ulft, L. H., van de Wal, R. S. W., and van den Broeke, M. R.: Modelling the climate and surface mass balance of polar ice sheets using RACMO2 Part 1: Greenland (1958–2016), The Cryosphere, 12, 811–831, https://doi.org/10.5194/tc-12-811-2018, 2018.
- Pandolfo, J. P.: Wind and Temperature Profiles for Constant-flux Boundary Layer in Lapse Conditions with a Variable Eddy Conductivity to Eddy Viscosity Ratio, Journal of the Atmospheric Sciences, 23, 495–502, 1966.
- Smeets, C. J. P. P. and van den Broeke, M. R.: Temporal and Spatial Variations of the Aerodynamic Roughness Length in the Ablation Zone of the Greenland Ice Sheet, Boundary-Layer Meteorology, 128, 315–338, doi 10.1007/s10546–008–9291–0, 2008a.
- Smeets, C. J. P. P. and van den Broeke, M. R.: The Parameterisation of Scalar Transfer over Rough Ice, Boundary-Layer Meteorology, 128, 339–355, doi:10.1007/s10.546–008–9292–z, 2008b.
  - Tiedtke, M.: A Comprehensive Mass Flux Scheme for Cumulus Parameterization in Large-Scale Models, Monthly Weather Review, 117, 1779–1800, 1989.
- Undén, P. et al.: The High Resolution Limited Area Model, Hirlam-5 scientific documentation, Swedish Meteorological and Hydrological Institute, Norrköping, Sweden, 2002.
  - van Angelen, J. H., Lenaerts, J. T. M., Lhermitte, S., Kuipers Munneke, P., van den Broeke, M. R., van Meijgaard, E., and Smeets, C. J. P. P.: Sensitivity of Greenland Ice Sheet surface mass balance to surface albedo parameterization: a study with a regional climate model, The Cryosphere, 6, 1175–1186, 2012.
  - van Angelen, J. H., Lenaerts, J. T. M., van den Broeke, M. R., Fettweis, X., and van Meijgaard, E.: Rapid loss of firn pore space accelerates 21st century Greenland mass loss, Geophysical Research Letters, 40, 2109–2113, doi:10.1002/grl.50490, 2013.
  - van den Broeke, M. R.: Depth and Density of the Antarctic Firn Layer, Arctic, Antarctic, and Alpine Research, 40, 432–438, 2008.
  - van den Broeke, M. R., Enderlin, E. M., Howat, I. M., Kuipers Munneke, P., Noël, B. P. Y., and van de Berg, W. J.: On the recent contribution of the Greenland ice sheet to sea level change, The Cryosphere, 10, 1933–1946, 2016.
  - van den Broeke, M. R., Box, J. E., Fettweis, X., Hanna, E., Noël, B. P. Y., Tedesco, M., van As, D., van de Berg, W. J., and van Kampenhout, L.: Greenland ice sheet surface mass loss: recent developments in observation and modelling, Current Climate Change Reports, 3, 345–456, doi:10.1007/s40641-017-0084-8, 2017.
  - van Kampenhout, L., Rhoades, A. M., Herrington, A. R., Zarzycki, C. M., Lenaerts, J. T. M., Sacks, W. J., and van den Broeke, M. R.: Regional grid refinement in an Earth system model: impacts on the simulated Greenland surface mass balance, The Cryosphere, 13, 1547–1564, 2019.
- 705 Van Tricht, K., Lhermitte, S., Lenaerts, J. T. M., Gorodetskaya, I. V., L'Ecuyer, T. S., Noël, B., van den Broeke, M. R., Turner, D. D., and van Lipzig, N. P. M.: Clouds enhance Greenland ice sheet meltwater runoff, Nature Communications, 7, https://doi.org/10.1038/ncomms10.266, 2016.
- Vaughan, D. G., Comiso, J. C., Allison, I., Carrasco, J., Kaser, G., Kwok, R., Mote, P., Murray, T., Paul, F., Ren, J., Rignot, E., Solomina, O., Steffen, K., and Zhang, T.: Climate Change 2013: The Physical Science Basis. Contribution of Working Group 1 to the Fifth Assessment Report of the Intergovernmental Panel on Climate Change, chap. Observations: Cryosphere, Cambridge University Press, 2013.

Vizcaíno, M., Lipscomb, W. H., Sacks, W. J., van Angelen, J. H., Wouters, B., and van den Broeke, M. R.: Greenland Surface Mass Balance as Simulated by the Community Earth System Model. Part I: Model Evaluation and 1850–2005 Results, Journal of Climate, 26, 7793–7812, 2013.