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Using MODIS land surface temperatures and the Crocus snow model to understand the warm bias of ERA-Interim reanalyses at the surface in Antarctica

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Abstract

MODIS land surface temperatures in Antarctica were processed in order to produce a gridded data set at 25 km resolution, spanning the period 2000–2011 at an hourly time-step. The AQUA and TERRA orbits and MODIS swath width, combined with frequent clear-sky conditions, lead to very high availability of quality-controlled observations: on average, hourly data are available 14 h per day at the grid points around the South Pole and more than 9 over a large area of the Antarctic Plateau. Processed MODIS land surface temperatures, referred to hereinafter as MODIS T_s , were compared with in situ hourly measurements of surface temperature collected over the entire vear 2009 by 7 stations from the BSRN and AWS networks. In spite of an occasional failure in the detection of clouds, MODIS T_s exhibit a good performance, with a bias ranging from –1.8 to 0.1 °C and errors ranging from 2.2 to 4.8 °C root mean square at the 5 stations located on the plateau. These results show that MODIS T_s can be used as a precise and accurate reference to test other surface temperature data sets. Here,

- ¹⁵ we evaluate the performance of surface temperature in the ERA-Interim reanalysis. During conditions detected as cloud-free by MODIS, ERA-Interim shows a widespread warm bias in Antarctica in every season, ranging from +3 to +6°C on the plateau. This confirms a recent study which showed that the largest discrepancies in 2 m air temperature between ERA-Interim and the HadCRUT4 data set occur in Antarctica.
- A comparison with in situ surface temperature shows that this bias is not strictly limited to clear-sky conditions. A detailed comparison with stand-alone simulations by the Crocus snowpack model, forced by ERA-Interim, and with the ERA-Interim/land simulations, shows that the warm bias may be due primarily to an overestimation of the surface turbulent fluxes in very stable conditions. Numerical experiments with Crocus
- ²⁵ show this is likely due to an overestimation of the surface exchange coefficients under very stable conditions.



1 Introduction

Ice-sheet decline is the largest potential source of uncertainties for future sea level rise, which has led to a growing interest in the observation and modeling of the interactions between the ice-sheets and their environment. While it is clear that the Greenland

- ⁵ ice-sheet loses mass from both enhanced discharge and decreasing surface mass balance due to increased surface melting (Rignot et al., 2011), the changes in Antarctica in the recent decades have a complex signature. In this context, it is of vital importance to monitor and understand the processes controlling the surface heat and mass exchanges between the Antarctic ice-sheet and the atmosphere. As in other regions of
- the world, meteorological reanalyses are commonly used, either as climate series to interpret or even detect recent changes (Bromwich et al., 2012) or as boundary conditions for regional meteorological and climate models (Van de Berg et al., 2008; Gallée and Gorodetskaya, 2010; Bromwich et al., 2013). However, the scarcity of assimilated observations constraining the analysis, along with weaknesses in the modeling of some
- key processes for the polar regions such as the formation of mixed-phase clouds and the extreme stability of the atmospheric boundary layer (ABL) – increase the uncertainty in the quality of the reanalyses over Antarctica. Nowadays, in situ observations that were not used in the re-analyses are difficult to come by, limiting our ability to evaluate the reanalyzed variables.
- Following pioneering work from Comiso (2000) on the use of satellite surface temperatures to detect changes in the Antarctic climate (Schneider et al., 2004; Steig et al., 2009) and more recent work from Hall et al. (2012, 2013) on the detection of Greenland ice-sheet surface melting and changes, the present study focuses on the use of remote-sensed surface temperature to evaluate the quality of reanalyses and snow
- ²⁵ model outputs under clear-sky conditions. As shown in Brun et al. (2011), surface temperature is more appropriate than 2 m air temperature, hereafter T_{2m} , for investigating the energy budget of snow-covered surfaces and evaluating some aspects of meteorological and snow models. This is particularly true in polar regions where large



temperature gradients near the surface are common. In contrast to T_{2m} , snow surface temperature can be estimated from space-born sensor observations under clear-sky conditions using the thermal emission of the surface in the infrared. In the first part of this paper, the Moderate-Resolution Imaging Spectroradiometer (MODIS) clear-sky land surface temperatures ($T_{\rm s}$), regridded at 25 km resolution and at hourly time-steps, 5 are evaluated against hourly series of in situ observations of surface temperature. Such an evaluation provides better insight than previous evaluations based on a comparison with near-surface temperature, as in Wang et al. (2013). In the second section, MODIS T_s from 2000 to 2011 are compared with 3 h ERA-Interim (Dee et al., 2011) surface temperatures and hourly snow surface temperatures simulated by the detailed snow-10 pack model Crocus (Brun et al., 1992; Vionnet et al., 2012). A warm bias is found and its spatial and temporal variations are analyzed. Then, the causes of this bias are explored with a special focus on the turbulent flux of sensible heat under very stable conditions.

15 2 Data and methods

2.1 MODIS land surface temperature

Clear-sky T_s are derived from observations of the MODIS instruments on board Terra and Aqua spacecrafts. The two MODIS instruments view the entire surface of the Earth every 1–2 days at most thanks to a large swath (i.e. the cross track size of the image)

- ²⁰ of 2330 km. We used Terra MOD11 and Aqua MYD11 products in version-5. These products were evaluated by Wan (2014) with the radiance-based method: using atmospheric temperature and water profiles and surface emissivity, the radiance-based method calculates MODIS T_s from brightness temperatures in band 31 through radiative transfer simulations. By applying this method on 42 sites, Wan (2014) found ²⁵ MODIS Ts errors within ±2°C for all the sites but 6 bare soil sites (not including South
- ²⁵ MODIS Ts errors within $\pm 2^{\circ}$ C for all the sites but 6 bare soil sites (not including South Pole). For the South Pole site, MODIS Ts error is only -0.5° C. Accuracy of MODIS T_{s}



depends primarily on the quality of the detection of clouds (Hall et al., 2008). When clear-sky conditions are detected, the generalized split-window land surface temperature algorithm of Wan and Dozier (1996) is used to retrieve T_s for MODIS pixel along with emissivities in bands 31 (10.78 to 11.28 µm) and 32 (11.77 to 12.27 µm)

- ⁵ (http://modis.gsfc.nasa.gov/about/specifications.php). For the comparison with reanalysis and model outputs, the 1 km resolution product was projected onto a 25 km grid in stereographic polar projection. To create a hourly data record of clear-sky T_s , all data of a sufficient quality acquired within a given hour in a grid cell were averaged. The MODIS T_s algorithm provides two indicators of quality: quality assurance (QA) and quality con-
- ¹⁰ trol (QC). To minimize cloud detection errors, we selected only the pixels produced with "good quality" or "fairly calibrated" according to the MODIS quality nomenclature. The data set extends from March 2000 to December 2011, as AQUA data is available only from July 2002. Figure 1 shows the mean rate of available data in Antarctica over the period, for the annual mean (Fig. 1a), for winter (JJA) (Fig. 1b) and for summer (DJF) ¹⁵ (Fig. 1c). The data availability depends on:
 - the revisit time of MODIS, which presents 2 areas of maximum controlled by the swath width (2230 km) and the orbit inclination. The maximum is in the area south of 87° S centered around the South Pole; a second local maximum is in the area extending from 71° S to 87° S;
- cloudiness, which is less marked over the Antarctic Plateau than over West Antarctica or coastal regions.

Both variables explain that the availability of hourly clear-sky MODIS T_s is at its maximum around the South Pole, with approximately 14 hourly T_s available per day on average and more than 9 over a large area of the Antarctic Plateau. In the coastal areas and West Antarctica, hourly data are available for fewer than 5 h per day on average. MODIS LST (Land Surface Temperature) are not produced in ice shelf areas because of MODIS land definition. On the plateau, data availability is higher in summer than in winter. This can be explained by more frequent clouds in winter (Bromwich et al.,



2012) and by more frequent failures in cloud detection during the polar night (Comiso, 2000). Figure 1d–f shows the 2000–2011 annual, winter and summer mean value of the hourly clear-sky MODIS T_s , respectively.

2.2 In situ observations

- Several sites in Antarctica provide near-continuous, long-term data sets of variables relevant to monitoring boundary-layer conditions. To assess the accuracy of MODIS *T*_s, we processed upwelling and downwelling long-wave radiation observations (LW_{up} and LW_{down}) provided at an hourly time-step by 3 BSRN (Baseline Surface Radiation Network) stations (Ohmura et al., 1998): Dome C (75°06′ S 123°20′ E, 3233 ma.s.l.),
 South Pole (90° S 0° E, 2835 ma.s.l.), Syowa (69° S 39°35′ E, 18 ma.s.l.) and 4 automatic weather stations (AWS) operated by the Institute for Marine and Atmospheric research, Utrecht University (Van den Broeke et al., 2004): Kohnen (AWS9) (75° S
- $0^{\circ}40'$ E, 2892 ma.s.l.), Plateau Station B (AWS12) (78°38' S 35°38' E, 3619 ma.s.l.), Pole of Inaccessibility (AWS13) (82°3' S 54°34' E, 3718 ma.s.l.), and Princess Elisa-
- ¹⁵ beth (AWS16), the latter operated in collaboration with Katholic University Leuven, (Gorodetskaya et al., 2013) (71°57′ S 23°21′ E, 1372 ma.s.l.). Note that the BSRN Georg Von Neumayer station (70°39′ S 8°15′ W, 42 ma.s.l.) cannot be used due to its location on the Ekström ice shelf where MODIS LST are not produced.

BSRN data were collected at stations with permanent staff, ensuring regular cleaning

- of the pyrgeometers and limits the perturbations due to riming which is very frequent on the Antarctic Plateau. In contrast to BSRN, AWS pyrgeometers are visited once a year at most. Van den Broeke et al. (2004) performed an evaluation of the quality of longwave radiation measured at these AWS, which revealed frequent errors due to riming of the pyrgeometers, especially in winter. To detect erroneous measurements, the authors proposed to reject any data with LW.
- $_{25}$ proposed to reject any data with LW_{down} larger than LW_{up} . We further analyzed these observations and decided to use a more conservative filter: AWS data are rejected when $LW_{down} > (LW_{up} 5)$ (expressed in Wm⁻²). This selection reduces the amount of data available for the winter. Nevertheless, we believe that some of the filtered data are



still affected by riming. In order to assess the possible impact of such processing, we also analyzed observations from two additional pyrgeometers at Dome C which do not benefit from the standard BSRN cleaning procedure. They were available only for the year 2012.

⁵ Snow surface temperature T_s at the stations was derived according to:

$$T_{\rm s} = \sqrt[4]{\frac{\rm LW_{up} - (1 - \epsilon)\rm LW_{down}}{\epsilon\sigma}}$$

where e is snow surface emissivity, σ is the Stefan–Boltzmann constant, and T_s is snow surface temperature.

¹⁰ In the long-wave domain [5–40 µm], snow behaves almost as a black body. Snow emissivity has been found to range from 0.98 and 0.99 for grain size larger than 75 µm and close to 0.985 for fine-grain snow with grain size equals to 50 µm (Dozier and Warren, 1982). In order to derive T_s , ϵ has been set to the constant value 0.99 as in Brun et al. (2011). Sensitivity tests with ϵ values set to 0.98 and 1.0 were made, ¹⁵ leading to differences in surface temperature smaller than 0.1 °C on average (0.080 and 0.079 °C respectively).

2.3 ERA-interim surface temperature

The ERA-Interim reanalysis includes a comprehensive set of variables describing the surface and the ABL. We focused on the ERA-Interim skin temperature, hereafter ERA-i T_s , which forms the interface between the soil and the atmosphere in the Integrated Forecast System (IFS) (European Centre for Medium-Range Weather Forecasts (ECMWF), http://www.ecmwf.int/products/data/operational_system/evolution). IFS is the meteorological model and assimilation scheme used in the ERA-Interim analysis to assimilate observations. ERA-i T_s is the temperature used in the derivation of the heat budget between the atmosphere and the surface. ERA-i T_s was extracted at

 $0.5^\circ\,$ resolution in latitude and longitude and then projected at 25 km resolution on the



(1)

same grid as the MODIS T_s using bi-linear interpolation. ERA-i T_s is not produced by the ERA-Interim analysis scheme and hence does not benefit from the assimilation of any surface temperature observations. It is the result of the resolution of the energy balance equation during the forecast step of IFS. We extracted ERA-i T_s at a 3 h time step, at analysis time and at the 3 to 9 h forecast from the 0 and 12 h analysis. We also extracted the skin temperature from a new ECMWF product named ERA-Interim/Land (Balsamo et al., 2012). This temperature, hereinafter referred to as ERA-i/land T_s , was derived from a stand-alone land-surface model simulation using the land surface model HTESSEL (Hydrology Tiled ECMWF Scheme for Surface Exchanges over Land) (Balsamo et al., 2009), with meteorological forcing from ERA-Interim. ERA-i/land T_s was

regridded exactly as ERA-i T_s . It is available every 6 h.

2.4 Surface temperature simulation using Crocus snowpack model

Within the modeling platform SURFEX (Masson et al., 2013), the Crocus snowpack model (Brun et al., 1992; Vionnet et al., 2012), was run in a stand-alone mode, using
meteorological forcing data from ERA-Interim. The ERA-Interim total precipitation was turned into snowfall at temperatures below 1 °C and into rainfall above. Crocus simulates the time evolution of snow properties in homogeneous layers. The number of layers evolves adaptively and is limited to 50 in this study. Heat exchanges, solar energy absorption, snow metamorphism and compaction, phase changes, and water percolation are simulated within the snowpack along with the energy and mass exchanges

- in the atmosphere. The albedo is a prognostic variable, depending on the type, size and age of the crystals of the snow surface layers. To run the model, near-surface meteorological data including T_{2m} , 2 m air humidity, 10 m wind velocity, precipitation rate, LW_{down} , SW_{down} and air pressure were extracted at 0.5° resolution from ERA-Interim and then projected onto the 25 km grid (21 499 points on the ice-sheet) as for ERA-i T_s .
- Crocus results are not independent from ERA-i T_s since the latter strongly influences ERA-i T_{2m} which is used as a forcing data. All the grid points were initialized with the same snow profile (20 m snow water equivalent), deduced from observations made at



Dome C in 2009, as in Brun et al. (2011). Since this is a rough approximation, a spin up of the model was obtained by running Crocus three times over one decade (forcing conditions were taken from July 1999 to July 2009) in a loop mode in order to produce an initial profile in equilibrium over each grid point with the local climate conditions.

⁵ A last run was then performed from July 1999 to December 2012, in order to produce the hourly time series of snow surface temperatures used in the following, hereinafter named Crocus T_s , covering the whole Antarctic continent at 25 km resolution.

3 Evaluation results

3.1 LST MODIS evaluation

¹⁰ Hourly cloud-free MODIS T_s at 25 km resolution, described in Sect. 2.1, were evaluated with respect to in situ observations (Sect. 2.2). The year 2009 was chosen to obtain the maximum number of available stations. Figure 2 shows the comparison between in situ T_s and MODIS T_s over the whole data set.

3.1.1 Evaluation with respect to stations located over the plateau

- ¹⁵ At all stations located on the plateau, MODIS T_s exhibit biases ranging from -2.0 to 1.2 °C and Root Mean Square Errors (RMSE) ranging from 2.7 to 4.8 °C. This is a good performance considering the fact that the comparison is performed at an hourly timestep. A significant part of the RMSE comes from a few largely underestimated MODIS T_s . The examination of LW_{down} provided by the BSRN stations (South Pole and Dome C in 2009) reveals that the largest errors are due to erroneous detection of clear-sky con-
- ditions. This is consistent with the likely underestimation of cloudiness on the plateau reported by Bromwich et al. (2012). The regression slope is very close to 1, showing almost no seasonal variability in the MODIS T_s bias. The conservative filter described in Sect. 2.2 in AWS stations suppresses cases with a false dectection of clear-sky conditions by MODIS as well. This is illustrated with Dome C 2012 better scores (Fig. 2h)



compared to Dome C 2009 (Fig. 2g). In spite of the possible accumulation of several error sources – MODIS cloud detection, time shift of the MODIS data to the closest full hour time-step, difference in the representative scale of the different data sets (25 km for the projected MODIS T_s against a few meters for the in situ observations), occa-

- ⁵ sional errors in in situ observations due to riming MODIS T_s exhibit quite good performances on the Antarctic Plateau. This confirms and extends, in space and time, the results reported in Brun et al. (2011). In this previous study, MODIS T_s over Dome C were successfully compared over a 11 day period with several independent hourly time series of snow surface temperature. The MODIS T_s data set clearly has great potential for the evaluation of surface temperature produced by model or analysis outputs in
- ¹⁰ tial for the evaluation of surface temperature produced by model or analysis outputs in Antarctica.

3.1.2 Evaluation with respect to coastal stations

MODIS T_s exhibit larger errors at coastal stations. Syowa has only 37 data points, due to the quasi-permanent detection of clouds by MODIS, which limits the significance 15 of the results. The bias is low and the 7.5 °C RMSE is mainly due to 2 erroneous measurements. Princess Elisabeth station provides a much larger data set. The cold bias (-2.7 °C) and the RMSE (4.8 °C) mainly stem from erroneous cloud detection leading in this specific case to a severe underestimation of the surface temperature. The physiographic heterogeneity around the station may also be a contributing factor. 20 In the rest of the paper, we focus on the Antarctic Plateau, where hourly MODIS T_s are

more frequent and of better quality than in coastal regions.

3.2 ERA-interim and Crocus surface temperature analysis

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ERA-i T_s (3 hourly data described in Sect. 2.3) and Crocus T_s (hourly data described in Sect. 2.4) were evaluated with respect to the MODIS T_s data set over the period 2000–2011. It must be kept in mind that the latter includes only observations under meteorological conditions analyzed as cloud-free by the MODIS cloud detection algo-



rithm, hereinafter referred to simply as clear-sky conditions. Figure 3 shows the bias and Fig. 4 the RMSE of ERA-i T_s and Crocus T_s with respect to hourly MODIS T_s . Era-i T_s exhibits a widespread warm bias ranging from +4 to +6 °C on most of the plateau. This bias is at its minimum in winter and maximum in summer around the central part

⁵ of the plateau. The Crocus T_s bias is much better, with values ranging from -2 to $+2^{\circ}C$ on most of the plateau. Local maxima correspond to areas where ERA-i T_s exhibits the warmest biases, which is consistent with the fact that Crocus was forced with ERA-Interim T_{2m} . The difference between ERA-i T_s and Crocus T_s RMSE is largely due to the difference in their respective biases.

10 4 Discussion

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The warm bias in ERA-i T_s undoubtedly has an impact on the ERA-Interim T_{2m} . Indeed, the latter is not produced by the analysis scheme but by a diagnosis from the surface temperature and the air temperature at the lowest atmospheric vertical level of IFS. Air temperature in the lowest atmospheric levels is constrained very weakly by the observations in the Antarctic Plateau because of both the scarcity in radio-soundings and the absence of low-level observations by satellite sounders (Rabier et al., 2010). Hence ERA-interim T_{2m} evolves almost freely under the combined influence of both surface temperature, derived from the surface energy budget, and temperature of higher levels

- in the atmosphere. Genthon et al. (2010) has already noted a significant warm bias in the temperature forecasted by IFS in summer at all levels of the instrumented Dome C tower (sensors are located from 4.3 m to 45 m above the surface). This was attributed to the combination of an underestimated albedo – a previous albedo evaluation from Dome C BSRN data provides an average value around 0.83 – and an attenuation of the nocturnal radiative cooling. A comparison with MODIS T_s shows that the problem
- ²⁵ affects most of the plateau (and even most of Antarctica) and all seasons, including the long polar night, which means that it cannot be due to an underestimation of the albedo alone.



Figure 5 shows the comparison between ERA-i T_s and in situ observations used in Sect. 3.1 at 4 stations (Dome C, South Pole, Plateau Station B and Pole of Inaccessibility) during 2009. The left column (Fig. 5a, c, e and g) compares ERA-i T_s with all available in situ observations, corresponding to all-weather conditions, while the right ₅ column (Fig. 5b, d, f and h) uses only in situ observations when MODIS T_s is available at the same time, which corresponds to clear-sky conditions. The comparison with in situ surface temperature under clear-sky conditions clearly confirms the warm bias detected over the entire plateau with MODIS T_{e} . The warm bias is slightly lower when all weather conditions are considered but is still quite significant (+3.2, +3.0, +3.2 and +3.0 °C, respectively). This means that ERA-i $T_{\rm s}$ exhibits a warm bias even 10 under cloudy conditions. In Fig. 6, Crocus T_s exhibits a very low bias (-0.5, -0.3, -0.3) and -0.4 °C respectively for all-weather conditions and -0.6, +0.2, -0.1 and -0.2 °C respectively for clear-sky conditions), confirming the previous comparison with MODIS $T_{\rm s}$. In Fig. 2d, comparing MODIS $T_{\rm s}$ to in situ $T_{\rm s}$ at Plateau Station B, we observe two fold behavior at higher T_s which do not show in Figs. 5e and f, 6e and f. It probably re-15

- veals cases where false cloud detections induce underestimated MODIS T_s . Crocus T_s RMSE is remarkably low (from 3.1 to 4.4 °C) considering the errors in the hourly in situ observations and the uncertainties in the ERA-Interim forcing. Consequently, the evaluation against in situ observations is very consistent with the one made against MODIS
- $_{20}$ $T_{\rm s}$ on the whole plateau, increasing the confidence in the ERA-i $T_{\rm s}$ warm bias. It is also consistent with a recent study from Jones and Harpham (2013) showing that the main discrepancy between ERA-Interim and HadCRUT4 $T_{\rm 2m}$ over all continental surfaces is a warm bias in East Antarctica. In order to identify the origin of this warm bias, Fig. 7 shows the time series of the difference between observed and modeled variables from
- ²⁵ 2 August 2009 to 16 September 2009 at South Pole. This period is illustrative of the general behavior of these variables during the polar night. First, ERA-Interim simulates the presence of clouds in a very realistic way. ERA-Interim clouds are detected by the difference between the ERA-Interim LW_{down} (red dotted line on the bottom panel) and the ERA-Interim clear-sky LW_{down}, leading to the blue dotted line on the bottom panel,



which represents the contribution of ERA-Interim cloudiness to LW_{down}. Values equal to 0 indicate cloud-free conditions in ERA-Interim. Actual cloudy conditions can be identified by the peaks in the observed LW_{down} above the baseline clear-sky value, which is around 70 Wm⁻² during the considered period. Although ERA-Interim detects most of the actual cloudy conditions, the comparison shows that it underestimates the infrared 5 emissivity of the clouds. Of note is the asymmetry between the periods of increasing and decreasing surface temperature. During periods of increase, which generally correspond to increasing cloudiness, ERA-i T_s increases at a realistic rate. In the latter case, ERA-i T_s starts to decrease at a realistic rate but this rate slows down rapidly, leading to an overestimation of ERA-i T_s , often higher than +5 °C. Crocus T_s does not 10 show the same behavior, except when the difference between ERA-i T_s and the actual surface temperature is too high, as illustrated around 18 August. This is due to the warm bias in ERA-Interim T_{2m} which is used by Crocus and hence impacts Crocus T_s as well. For the combined reasons described below, we think that the detected overestimation of ERA-i T_s is due to the parameterization of the effect of stability on the 15 surface exchange coefficients used by IFS to derive the turbulent fluxes between the surface and the lowest atmospheric level:

– ERA-i/land T_s , produced by a stand-alone simulation of HTESSEL with ERA-Interim forcing, exhibits the same behavior as ERA-i T_s . HTESSEL uses the same parameterization of the surface exchanges as IFS (stability function from Hoegstroem, 1988), in contrast to the formulation used in SURFEX and consequently in Crocus (Louis (1979) modified by Mascart et al. (1995), including a limitation of the maximum Richardson number).

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- Though HTESSEL has a better description of snow processes than the land scheme TESSEL (Tiled ECMWF Scheme for Surface Exchanges over Land) used in IFS, ERAi/land T_s does not significantly differ from ERA-i T_s. There are several differences between Crocus and HTESSEL, especially in terms of albedo and snow density, but they cannot explain the differences between their respec-



tive simulations shown in Fig. 7: there is almost no solar radiation at this time of the year and differences in the snow heat capacity and conductivity cannot lead to a long-lasting constant difference in surface temperature, as observed from 13 August to 19 August. Sub-surface flux in ERA-Interim has been derived from the temperature difference between the surface and the thermally active snow layer. Figure 7c shows that it is always very low (absolute value less than 5 Wm^{-2}). This is due to the large depth of this layer (1 m at South Pole), which leads to an overestimation of the thermal resistance and an underestimation of the conductive heat fluxes between the sub-surface and the surface. While this TESSEL feature cannot explain the overestimation of ERA-i T_s , it must be noticed that it should introduce significant error on the sub-daily time scales.

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- Figure 7c shows that the sensible heat fluxes are much larger in ERA interim than in Crocus simulations when ERA-i T_s and Crocus T_s are close. Latent heat fluxes are not shown in Fig. 7c because they are almost negligible during the period (absolute value less than 2 Wm^{-2} in both ERA Interim and Crocus simulation) and cannot explain the overestimation of ERA-i T_s . In general, the surface sensible heat fluxes from the atmosphere towards the surface are very high in ERA-Interim, as shown in Fig. 8 for August 2009. On most of the plateau, the mean fluxes are higher than 20 Wm^{-2} and even higher than 30 Wm^{-2} over large areas. Such permanent high fluxes at high-elevation and low-wind sites are incompatible with those reported in the literature. Reijmer and Oerlemans (2002) derived a mean sensible heat flux at Kohnen (AWS 9) around 12 Wm^{-2} in August, which is in agreement with the sensible heat fluxes calculated in winter at Kohnen by Van den Broeke et al. (2005a, b), while mean ERA-Interim fluxes reach 25 Wm^{-2} at the corresponding points during August 2009.
- ERA-i T_s overestimation cannot be due to an overestimation of LW_{down} because it would impact Crocus T_s similarly, which is not the case. Furthermore, Fig. 7 shows that during August 2009, the largest bias occurred at the South Pole under



clear-sky conditions at periods when $\mathrm{LW}_{\mathrm{down}}$ was perfectly represented in ERA-Interim.

- Figure 5 clearly shows a systematic overestimation of ERAi T_s during the coldest periods at each individual station. It seems that ERA-i T_s cannot drop low enough during these situations, as already discussed from the time series in Fig. 7. These periods correspond to an extremely low LW_{down} which induces a strong radiative cooling at the surface and thus leads to very stable conditions. The shape of the cloud of points is very similar to the shape of the cloud of points in the left column of Fig. 3 in Jones and Harpham (2013) which compares ERA-Interim and HadCRUT4 T_{2m} in Antarctica. This is also the case for the lowest T_{2m} during DJF north of 60° N (Jones and Harpham, 2013, left column, raw 4), revealing that the ERA-Interim warm bias is not specific to Antarctica. It also affects Northern Eurasia in winter, an additional element calling into question the representation of the surface turbulent exchanges under very stable conditions, especially when the ground is covered by snow.

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The difficulty of properly estimating the surface turbulent fluxes under very stable conditions has been extensively documented (for example Brun et al., 1997; Martin and Lejeune, 1998; Essery and Etchevers, 2004; Anderson and Neff, 2006; Sukoriansky et al., 2006; Town and Walden, 2009; Genthon et al., 2010; Holtslag et al., 2013).
Ad hoc treatments are often introduced in meteorological and snow models to solve the problem, as was done in SURFEX/Crocus with the introduction of the limitation in the Richardson number. This is treated differently in IFS, which could explain the warm bias. Holtslag et al. (2013) show that *T*_{2m} forecasted in winter over snow-covered areas with IFS are much more sensitive to slight changes in the stability functions with the 25 current version of IFS than they were in previous versions.

In order to demonstrate the sensitivity of T_s to air temperature and to the representation of surface turbulent fluxes, four numerical experiments were made with Crocus under the following configurations: three experiments with a constant change in



- ERA-Interim T_{2m} of +2, -2 and -4°C, respectively, and an additional experiment with a change in ERA-Interim T_{2m} of -4°C and a change in the maximum Richardson number from its original 0.2 value to 0.1, which enhances the turbulent fluxes towards the surface in very stable conditions. The comparison with the control experiment in July 2009 leads to the following conclusions:
 - the impact of the sole changes in the forcing air temperature leads to a change in Crocus T_s equal to only about half of the air temperature change. It shows how very stable conditions attenuate the impact of T_{2m} on the surface temperature;
 - a lower maximum Richardson number used in Crocus almost balances the air temperature decrease of -4°C over a large part of the Antarctic Plateau.

The last experiment clearly shows how a small change in the parameterization of the effects of stability on the surface exchange coefficients drastically changes the snow surface temperature.

5 Conclusions

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- ¹⁵ Thanks to its orbital characteristics and to its large swath width, MODIS shows great potential in the observation of the surface temperature of the Antarctic Plateau under clear-sky conditions. Thus, more than 9 hourly observations per day are retrieved on average on the plateau, and they compare very well with in situ surface temperature observations, in terms of both bias and RMSE. To our knowledge, no previous study
- has performed an evaluation of MODIS T_s with as much detail and as many in situ observations. Further, by comparing in situ surface temperature instead of in situ near-surface air temperature, we avoid the uncertainties in the observation of T_{2m} over the Antarctic Plateau as documented in Genthon et al. (2010).

Hourly MODIS $T_{\rm s}$ from 2000 to 2011 were used to evaluate the accuracy of snow

²⁵ surface temperature in the ERA-Interim reanalysis and the one produced by a standalone simulation with the Crocus snowpack model using ERA-Interim forcing. It reveals



that ERA-Interim has a widespread warm bias on the Antarctic Plateau, ranging from +3 to +6°C depending on the location. This is consistent with a recent comparison of ERA-Interim T_{2m} with the HadCRUT4 data set (Jones and Harpham, 2013). Considering the very low constraint by the observations of the analyzed ABL temperature

- in ERA-Interim, the warm bias 2 m above the surface is due mainly to the bias at the snow surface. Comparison with in situ surface temperature shows that this bias is not limited to clear-sky conditions. At this stage, it is difficult to estimate the impact of this bias on other ERA-Interim variables, such as temperature and humidity in the ABL and snow accumulation. A detailed comparison with Crocus outputs and with the ERA-
- Interim/land stand-alone outputs by the new ECMWF land scheme (Balsamo et al., 2012) shows that the warm bias may be due primarily to the overestimation of the surface turbulent sensible heat fluxes in very stable conditions. Numerical experiments with Crocus show that small changes in the turbulent flux parameterization strongly impact surface temperature, highlighting the sensitivity of simulated surface tempera-
- ¹⁵ tures to poorly known parameters. According to the method developed in this study, hourly MODIS *T*_s in Antarctica are particularly well suited for evaluating the surface temperature simulated by various types of models: meteorological models, global or regional climate models and stand-alone snow models. This should help in the identification of current model weaknesses and lead to improved future reanalyses, which are necessary for a better detection and understanding of climate change in Antarctica.

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Fig. 1. Averaged number of hours per day with high quality data (2000–2011): (a) annual mean, (b) winter mean (JJA) and (c) summer mean (DJF). Averaged MODIS T_s (2000–2011): (d) annual mean,(e) winter mean (JJA) and (f) summer mean (DJF). "Pole of I." shows the location of Pole of Inaccessibility station.



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Fig. 2. Comparisons of MODIS T_s and in situ T_s at **(a)** South Pole, **(b)** Syowa, **(c)** Kohnen base (AWS9), **(d)** Plateau Station B (AWS12), **(e)** Pole of inaccessibility (AWS13), **(f)** Princess Elisabeth station (AWS16), **(g)** Dome C in 2009 and **(h)** Dome C in 2012. "Pole of I." means Pole of Inaccessibility and "Pr Elisabeth" means Princess Elisabeth. The number N of simultaneous MODIS T_s and in situ T_s used in the evaluation primarily depends upon satellite overpassing and cloudiness. In AWS stations, N also depends upon the filter used to select data not affected by riming. The green line represents the 1 : 1 line.







Fig. 4. (a) 2000–2011 averaged ERA-i T_s RMSE, **(b)** ERA-i T_s RMSE in winter (JJA) and **(c)** ERA-i T_s RMSE in summer (DJF), with respect to MODIS T_s . **(d)** 2000–2011 averaged Crocus T_s RMSE, **(e)** Crocus T_s RMSE in winter (JJA) and **(f)** Crocus T_s RMSE in summer (DJF), with respect to MODIS T_s .

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Fig. 5. Comparisons of ERA-i T_s and in situ T_s at **(a)** Dome C, **(c)** South Pole, **(e)** Plateau Station B and **(g)** Pole of Inaccessibility. Same comparisons but only when MODIS T_s are available at the same time: **(b)** Dome C, **(d)** South Pole, **(f)** Plateau Station B and **(h)** Pole of Inaccessibility. The green line represents the 1 : 1 line.





Fig. 6. Comparisons of Crocus T_s and in situ T_s at **(a)** Dome C, **(c)** South Pole, **(e)** Plateau Station B and **(g)** Pole of Inaccessibility. Same comparisons but only when MODIS T_s are available at the same time: **(b)** Dome C, **(d)** South Pole, **(f)** Plateau Station B and **(h)** Pole of Inaccessibility. The green line represents the 1 : 1 line.





Fig. 7. (a) Comparison between different observations of surface temperature at South Pole: BSRN Ts (solid black curve), Crocus Ts (solid pink curve), ERA-i Ts (red point), LST MODIS (solid blue curve) and ERA-i/land Ts (green point). **(b)** Comparison between thermal radiations: BSRN LW_{down} (solid black curve), ERA-i LW_{down} (red point) and ERA-i LW_{down_cloud} (blue point). ERA-i LW_{down_cloud} was obtained by the difference between ERA-i LW_{down} and ERA-i clear-sky LW_{down}. **(c)** Comparison between turbulent fluxes of sensible heat: Crocus *H* (violet point), ERA-i *H* (red point) and ERA-i sub-surface flux (blue point).







