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Validating surface downwelling solar irradiances estimated by the McClear model under cloud-free skies in the United Arab Emirates

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Abstract

McClear, a fast model based on a radiative transfer solver, exploits the atmospheric properties provided by the EU-funded MACC project (Monitoring Atmospheric Composition and Climate) to estimate the surface downwelling solar irradiances for cloud-free instances. This article presents the first validation of the McClear model for the specific climate of the United Arab Emirates where skies are frequently cloud-free but turbid. McClear accurately estimates the global horizontal irradiance measured every 10 min at seven sites. The bias ranges from $-9$ W m$^{-2}$ ($-1\%$ of the mean observed irradiance) to $+35$ W m$^{-2}$ ($+6\%$). The root mean square error (RMSE) ranges from $22$ W m$^{-2}$ ($4\%$) to $47$ W m$^{-2}$ ($8\%$) and the coefficient of determination ranges from 0.980 to 0.990. Estimates of the direct irradiance at normal incidence exhibit an underestimation that is attributed to the overestimation of the aerosol optical depth in the MACC data set and not accounting for the circumsolar radiation in McClear. The corresponding bias ranges from $-57$ W m$^{-2}$ ($-8\%$) to $+6$ W m$^{-2}$ ($+1\%$). The RMSE ranges from $62$ W m$^{-2}$ ($9\%$) to $87$ W m$^{-2}$ ($13\%$) and the coefficient of determination ranges from 0.830 to 0.863. When compared to two other models in the literature, McClear is better able to capture the temporal variability of the direct irradiance at normal incidence. The validation results remain comparable for the global horizontal irradiance.

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Keywords: Aerosols; Atmosphere; MACC; Solar radiation

1. Introduction

Accurate assessments of the solar resource are valuable for numerous applications, e.g. weather, climate, biomass, and of course solar energy. Due to the limited number of ground solar radiation measurement stations and the inaccuracy of interpolation methods between stations many models use satellite observations to estimate the solar radiation at ground level in a dense manner in space and in
time at a large temporal and spatial coverage (see e.g. Cano et al., 1986; Perez et al., 2002; Rigollier et al., 2004; Schillings et al., 2004; Sun and Liu, 2013; Qu et al., 2012a, 2012b; Zelenka et al., 1999). The solar radiation at ground level is also known as the surface solar irradiance (SSI), the surface solar radiation or the surface downwelling solar radiation. In cloud-free conditions, variable atmospheric parameters, namely aerosols and water vapour, are key factors in estimating the SSI and their accurate knowledge is required for accurate estimations (Lefevre et al., 2013; Oumbe et al., 2012a, 2013; Schroedter-Homscheidt and Oumbe, 2013).

A model that accurately estimates the SSI under cloud-free skies is of particular importance in determining the upper limit of the irradiance for a given location and instant. Furthermore, Oumbe et al. (2014) showed that in the case of infinite plane-parallel single- and double-layered cloud, the SSI computed by a radiative transfer model can be approximated with a great accuracy by the product of the SSI under cloud-free skies and a modification factor due to cloud properties and ground albedo only. Changes in clear-atmosphere properties have negligible effect on the latter so that both terms can be calculated independently. McClear (Lefevre et al., 2013) is a physical model based on look-up-tables established with the radiative transfer model libRadtran (Mayer and Kylling, 2005; Mayer et al., 2012) with the aim to accurately predict the downwelling broadband global horizontal irradiance (GHI), direct or beam horizontal irradiance, direct irradiance at normal incidence, abbreviated in direct normal irradiance (DNI), and diffuse horizontal irradiance (DHI) at ground level for cloud-free skies. Other cloud-free solar irradiance prediction models are available in the literature (Gueymard, 2012; Ineichen, 2006). An interesting feature of McClear is its design based on look-up-tables permits a very fast execution: it runs 100,000 times faster than libRadtran. Another feature is that McClear can be run as a Web service, using as inputs the reanalysis data set of atmospheric composition available worldwide from 2004 provided by the MACC project (Monitoring Atmospheric Composition and Climate) –funded by the European Commission– (Benedetti et al., 2009; Inness et al., 2013; Schroedter-Homscheidt et al., 2013).

The ten input parameters to McClear are: the solar zenith angle (Blanc and Wald, 2012), the ground albedo, the altitude of the ground level, the elevation above ground, the aerosol optical depth at 550 nm (AOD$_{550}$), the Ångström coefficient (Ångström, 1964), the aerosol type (Hess et al., 1998), the total column contents in ozone and water vapour and the atmospheric profile, i.e. the vertical profiles of temperature, pressure, density and volume
mixing ratio for gases (Anderson et al., 1986). The aerosol types and atmospheric profiles used in McClear are the same ones included in libRadtran. McClear also makes use of a worldwide set of 12 monthly maps of ground albedo parameters (Blanc et al., 2014b) that are derived from the MODIS (Moderate Resolution Imaging Spectroradiometer) products MCD43C1 and MCD43C2 (Schaaf et al., 2002).

The McClear model with inputs from MACC and MODIS is available as a Web service, i.e. an application that can be invoked via the Web. An interface has been developed to launch McClear within a standard Web browser via the catalogue of products on the MACC Web site (http://www.gmes-atmosphere.eu). Users need only to specify the latitude, longitude, the altitude of the site (optionally), time period of interest and the integration period of the solar radiation: 1 min, 15 min, 1 h, 1 day.

McClear has been previously validated (Lefevre et al., 2013) with respect to 1 min GHI and direct horizontal irradiance measurements from the Baseline Surface Radiation Network (BSRN) collected from 11 sites located throughout six continents. The BSRN network is described in Ohmura et al. (1998). The bias relative to the mean of the measurements, ranges from −1% to +4% (GHI) and −7 to +1% (direct horizontal irradiance), while the relative root mean square error (RMSE) ranges from 3% to 5% (GHI) and 5% to 11% (direct horizontal irradiance).

The United Arab Emirates (UAE) is a region which has ambitious plans for energy production from solar powered plants (Eissa et al., 2012; Mezher et al., 2011; Mokri et al., 2013). The climate of the UAE is specific as the cloud coverage is low, and the cloud-free skies range from being highly turbid due to high dust concentrations to “Rayleigh-like” blue skies (Gherboudj and Ghedira, 2014). The validation performed by Lefevre et al. (2013) does not include such specific conditions. The present work palliates this shortcoming and compares McClear estimates of the GHI and the DNI against measurements made every 10 min at seven stations in the UAE. The paper is organized as: description of the ground measurements (Section 2), validation results (Section 3), discussion on the MACC estimated aerosols and a comparison with two other irradiance estimation models (Section 4) and finally the conclusions (Section 5).

2. UAE ground measurements for validation

2.1. Solar irradiance ground measurements

The emirate of Abu Dhabi covers 87% of the land area of the UAE. It includes the variety of landscapes found in the UAE. A network of six stations has been installed in the emirate by Masdar Clean Energy. The company CSP Services installed the stations, performed their calibrations and provided the measurements at a 10 min temporal step (Geuder et al., 2014). The six stations are scattered throughout the emirate (Fig. 1 and Table 1) and are deemed to represent the climate of the UAE. Masdar City is located in the suburbs of Abu Dhabi (the city and capital), where the environment is near-coastal, desert and urban. The surrounding environment of the Madinat Zayed station is desert and it is located at Shams 1, a 100 MW concentrating solar thermal electric plant (Al Jaber, 2013). The surrounding environments of the three stations: Al Sweihan, Al Aradh and Al Wagan are similar to that of Madinat Zayed. The station East of Jebel Hafeet is situated near a rocky mountainous area and its altitude is slightly greater than the other five stations.

For all six stations, the irradiances were measured using a Rotating Shadowband Irradiometer (RSI). The RSI is a silicon photodiode, the LI-COR LI-200 Pyranometer, integrated with a rotating shadowband. This pyranometer has a spectral range from 400 nm to 1100 nm, and was calibrated against an Eppley Precision Spectral Pyranometer under natural daylight conditions (http://www.licor.com/env/products/light/pyranometers). CSP Services performed another calibration of the RSI measured irradiances with respect to a high precision meteorological station at Plataforma Solar de Almeria and it has checked that such a calibration is suitable for other sites in the Middle East and North Africa region (Geuder et al., 2014). During acquisition, the GHI is measured when the shadowband is stationary below the horizon of the photodiode and the DHI is measured when the rotating shadowband masks the entire solar disc from the pyranometer. The shadowband rotates once per minute. The direct horizontal irradiance is then computed by subtracting the DHI from the GHI. The DNI is computed from the direct horizontal irradiance and the solar zenith angle. In our case, the irradiances were averaged over 10 min. Only those measurements for the full year 2012 which passed the quality check procedures of Roesch et al. (2011) were used for validation.

A seventh meteorological station is used and is also located in Madinat Zayed 500 m apart that of Masdar. It was installed by the company Bertin Technologies in the framework of the PREDISOL (PREDicting SOLar radiation) project (Oumbe et al., 2012a, 2013). The GHI and DHI were measured respectively by one unshaded and one shaded Kipp and Zonen CMP11 pyranometers (http://www.kippzonen.com) that comprise a thermopile covering the spectral range from 285 nm to 2800 nm. The DNI was measured by the Kipp and Zonen CHPI pyrheliometer that comprises a thermopile covering the spectral range from 200 nm to 4000 nm. The sampling rate of the instruments was 1 s. Measurements were averaged over 1 min.

To match the temporal step of 10 min of the six Masdar stations, measurements from the Bertin station and the McClear estimates were averaged over 10 min provided all 1 min measurements within the period were present – i.e. no missing values – and valid according to the quality check procedures of Roesch et al. (2011). Then the algorithm of Long and Ackerman (2000) was applied to these 10 min data sets in order to retain reliable cloud-free
The first and third tests of Long and Ackerman, namely the normalized total shortwave magnitude test and the change in magnitude with time test, were kept unchanged. In the second test, the maximum diffuse short-wave test, the maximum DHI was empirically set at 300 W m\(^{-2}\), instead of the 150 W m\(^{-2}\) suggested by Long and Ackerman, to better represent the local conditions of the UAE. The fourth and final test, the normalized diffuse ratio variability test, was modified to accommodate for the 10 min time step instead of the 1 min time step of Long and Ackerman. The time span was changed from 11 min to 30 min and the threshold on the standard deviation of the normalized diffuse fraction was empirically set at 0.02. As an average, 37% of valid data were retained as cloud-free.

\[ KT = \frac{G}{E_0}. \]  
(1)

Similarly the direct clearness index \( K_TB \) is defined as:

\[ K_TB = \frac{B}{E_0}. \]  
(2)

The direct normal clearness index \( K_TBn \) is also defined, but with respect to \( E_{0n} \):

\[ K_TBn = \frac{B_n}{E_{0n}}. \]  
(3)

One notes that \( K_TB = K_TBn \) because \( B = B_n \cos(\theta_S) \) where \( \theta_S \) denotes the solar zenith angle.

2.2. AERONET ground measurement campaigns

Ground measurements from the NASA AERONET (AERosol RObotic NETwork) program are available over the UAE from 16 stations (Holben et al., 1998). The majority of the measurements were collected during the UAE Unified Aerosol Experiment which commenced in the year 2004, providing a remarkably increased AERONET data availability in the Middle East (Reid et al., 2005). The measurements at several AERONET stations correspond to short measurement campaigns for limited periods of time. Only five stations in the UAE have more than one year of measurements.

For each AERONET station, the measurements of the CIMEL CE-318 Sun photometer were converted into aerosol optical properties and are available for public access (http://aeronet.gsfc.nasa.gov). The data sets include the aerosol optical depth (AOD) at eight different wavelengths, as well as the solar zenith angle and the total column content in water vapour. The AERONET Level 2.0 products
3. Validation of McClear in the UAE

In this section the validation results of the McClear estimates for the GHI, DNI, clearness index and direct normal clearness index are presented for cloud-free instances. The deviations were computed by subtracting measurements for each instant from the McClear estimates. Three statistical measures were computed: bias, RMSE and the coefficient of determination ($R^2$). Therefore, a positive bias corresponds to an overestimation by McClear and vice versa. Relative values are expressed with respect to the mean observed value. Only four scatter density plots displaying the McClear values versus the ground measured—or derived—values are presented for two of the seven meteorological stations. The selected stations are AR (desert surrounding) and MasdC (near-coastal location exposed to desert, marine and anthropogenic aerosols). The figures also present the number of samples (ndata), the mean of observed values (mref), the bias, the RMSE, the correlation coefficient (CC), the 1:1 line ($x = y$) and the least-squares (LS) affine regression ($x = ay + b$). The validation results from all seven stations are presented in Tables 2–5.

The scatter density plot of the GHI estimated from McClear versus that measured at AR station is shown in Fig. 2. It is apparent that there is a high agreement between the McClear GHI and the measured GHI. Most observations lie around the 1:1 line and the scatter around this line is low. The relative bias is $-1\%$, the relative RMSE is 5% and $R^2$ is 0.986. Comparing the relative bias and RMSE with those reported by Guemymard (2012) who compared 18 broadband radiative models over Solar Village in Saudi Arabia, the errors of the McClear estimates are less than those of simple radiation models and comparable to those of the most detailed models. It can be concluded that McClear provides accurate results of the GHI over the site AR. The slight underestimation may be due to an overestimation in the AOD$_{550}$ extracted from the MACC reanalysis data set, which will be discussed in Section 4.1.

The scatter density plot of the DNI estimated from McClear versus the ground-derived DNI is shown in Fig. 3. In this case there is an underestimation for most of the observations, both low and high values. The scatter around the best fit line is more noticeable than for the GHI. All statistical measures exhibit poorer performances than those for the GHI. The relative bias is $-8\%$, the relative RMSE is 13% and $R^2$ is 0.846. The bias is attributed to two causes. The first is an overestimation in the AOD$_{550}$ input to McClear. Aerosols directly affect the DNI but their effect is less pronounced on the GHI, which may explain the difference in the scatter observed in the two plots. The second cause is the circumsolar radiation, which is the radiation which encounters forward scattering in the very near vicinity of the solar disc as a result of the large particles present in the atmosphere, i.e. dust and thin cirrus
clouds (Blanc et al., 2014a; Buie et al., 2003; Eissa et al., 2014; Oumbe et al., 2012b; Wilbert et al., 2013). Even though the circumsolar radiation is diffuse radiation, it is still intercepted within the field of view of the recommended measurement systems (WMO, 2010) for which the aperture half-angle is $2.5^\circ$ with a non-null sensitivity for up to $4^\circ$. The current version of McClear does not account for the circumsolar radiation, despite it is being measured by the ground instrumentation. This contributes to the observed underestimation.

Fig. 4 exhibits the scatter density plot of the clearness indices estimated from McClear versus these derived from measurements at the station AR. The relative bias is $-1\%$ and the relative RMSE is $5\%$, and are very similar to those obtained by the McClear GHI. However, $R^2$ is less than for GHI: 0.817 versus 0.986. The changes in solar radiation at the top of the atmosphere due to changes in geometry, namely the daily course of the Sun and seasonal effects, are usually well reproduced by models and lead to a de facto correlation between observations and estimates of the GHI (or DNI) hiding potential weaknesses. The clearness indices are stricter indicators of the performances of a model regarding its ability to estimate the optical state of the atmosphere. Though the clearness indices are not completely independent of the solar zenith angle as they decrease as the solar zenith angle increases, the dependency is much less pronounced than in the GHI or DNI. This explains why the correlation coefficient is less for the clearness index than for the GHI. Nonetheless, the observations are well scattered along the 1:1 line.

The direct normal clearness indices estimated from McClear are plotted against these derived from measurements in Fig. 5. The statistical indicators exhibit similar values to those of the DNI validation and the scatter along the line of best fit is limited.

When assessing the performance of McClear at the MasdC site, it is apparent that the McClear GHI is overestimated. The scatter density plot is shown in Fig. 6, and the relative bias is $+6\%$, the relative RMSE is $8\%$ and $R^2$ is 0.980. Even though the relative RMSE is satisfactory, there is an almost constant overestimation of the McClear GHI for most of the GHI range. This bias can be attributed to the overestimation of the DHI by McClear as there is negligible bias in the McClear DNI over this station. The validation indicators for the McClear DNI over MasdC (cf. Fig. 7) exhibit a relative bias of $+1\%$, a relative RMSE of $10\%$ and $R^2$ is 0.830. The scatter around the line of best fit is greater than that for the GHI.

The validations of the McClear clearness index (cf. Fig. 8) and the McClear direct normal clearness index (cf. Fig. 9) over MasdC are similar to those of AR. The rel-

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**Fig. 2.** Scatter density plot of McClear ($G^\text{MC}$) versus RSI ($G^\text{MES}$) global horizontal irradiance over Al Aradh, 2012.

**Fig. 3.** Scatter density plot of McClear ($B_n^\text{MC}$) versus RSI ($B_n^\text{MES}$) direct normal irradiance over Al Aradh, 2012.

**Fig. 4.** Scatter density plot of McClear ($K_t^\text{MC}$) versus RSI ($K_t^\text{MES}$) clearness index over Al Aradh, 2012.
ative bias and relative RMSE remain close to those obtained by the McClear GHI and the McClear DNI, respectively. A noticeably lower $R^2$ value is present for the McClear clearness index when compared to that of the McClear GHI.

Tables 2–5 respectively present the statistical indicators for the deviations between the estimated and ground measured –or derived– GHI, DNI, clearness index and direct normal clearness index for all seven validation stations. The statistical indicators are coherent between the stations, and no single station stands out. The differences between the Masdar MZ station (MZ$_{masd}$) and the Bertin MZ station (MZ$_{bertin}$) are due to the different instruments. When comparing the measured GHI and DNI at both stations for the same cloud-free instants, differences of 4% in relative RMSE and −4% in relative bias for GHI, and 3% in relative RMSE and −2% in relative bias for DNI, were observed. In this case the RSI irradiances were underestimated with respect to those measured by the Kipp and Zonen pyranometer and pyrheliometer. The measurements from the Kipp and Zonen instruments at the Bertin MZ station were taken as the reference values because (1) they correspond to the standard measurements recommended by the WMO (2010) and (2) the radiometers were cleaned on a daily basis. These errors explain the differences in the validations between both stations.

For the McClear GHI the relative bias ranges from −1% to +6%, relative RMSE ranges from 4% to 8% and $R^2$ ranges from 0.980 to 0.990. Generally the McClear esti-
mates are satisfactory, with low relative RMSE values. The bias is also low, but it can be further improved with inputs of better quality, cf. Section 4.1. When comparing the results in Table 2 to those previously obtained by McClear over 11 different stations around the globe (Lefevre et al., 2013), it is found that the relative bias is within the reported range of −1% to +4%, and the relative RMSE is also within the reported range of 3% to 5% for all stations, except for MasdC which exhibits a relative bias of +6% and a relative RMSE of 8%. This could be explained by the mixed nature of this site, which can be described as a near-coastal station exposed to desert, marine and anthropogenic aerosols.

The McClear DNI estimates exhibit slightly poorer performances when compared to those of McClear GHI, but they still remain satisfactory. The relative bias in Table 3 ranges from −8% to +1%, the relative RMSE ranges from 9% to 13% and R² ranges from 0.830 to 0.863. There is an underestimation in the McClear DNI for all stations but MasdC. An overestimation in the MACC AOD550 across the region of the UAE causes an underestimation in the McClear DNI. Accounting for the circumsolar irradiance in McClear would lead to improved results.

The three stations exhibiting the greatest relative bias in the DNI estimates are AR (−8%), MZsctm (−6%) and WA (−6%). These three stations have similar surroundings and this may imply that the MACC AOD550 is more overestimated in some regions than in others. The stations SW and EJH can probably be grouped together, as they are ∼60 km apart and they have the same relative bias of −2%. Due to the limited number of stations no strong conclusion in spatial distribution of the estimation error can be drawn and it could be fortuitous for the studied period. The 1.125° spatial resolution of MACC could not possibly depict the local atmospheric characteristics of a point location.

Tables 4 and 5 present the statistical indicators for the McClear clearness index and direct normal clearness index. The relative bias and relative RMSE are close to those obtained for the McClear GHI and DNI, respectively. The R² values are always less for the McClear clearness index than for the McClear GHI for the same stations.

Taking into account the accuracy of the RSI instrument, ±4.7% (GHI) and ±4.1% (DNI) as reported by CSP Services with the measurements themselves, it is reasonable to state that McClear provides satisfactory GHI and DNI estimates for cloud-free observations over the environment of the UAE.

4. Discussion

This section presents a comparison between the AOD550 from AERONET level 2.0 products and from MACC for a better understanding on the errors observed in the McClear irradiances. It is followed by a comparison between McClear and two other irradiance estimation models under cloud-free conditions.

4.1. AERONET versus MACC aerosol optical depths

The AERONET data sets do not provide the AOD550 directly, as measurements are not collected at the exact wavelength of 550 nm. For the sake of comparison with MACC AOD550, the AERONET AOD550 is computed by the Ångström law:

$$\tau_\lambda = \beta(\lambda)^{-x},$$

$$\ln(\tau_\lambda) = \ln(\beta) - x \ln(\lambda),$$

where \(\tau_\lambda\) is the AOD at wavelength \(\lambda\), \(\lambda\) is the wavelength presented in \(\mu m\), \(\beta\) is the AOD at 1000 nm and \(x\) is the Ångström coefficient. The \(x\) and \(\beta\) coefficients were computed by linearly transforming Eq. (4) into Eq. (5) and fitting \(\ln(\tau_\lambda)\) with \(\ln(\lambda)\) from the AODs available from AERONET for the wavelength interval [440 nm, 870 nm], where the slope of this linear fit is \(-x\) and the intercept is \(\ln(\beta)\). The time sampling of the AERONET Level 2.0 product is irregular and varies from a few seconds to hours, while MACC has a temporal resolution of 3 h. Therefore, the MACC observations were interpolated in space and in time to match the AERONET acquisition time and the location of the site in question.

The AOD550 from MACC are compared to those from AERONET at each of the 16 AERONET stations in the UAE. Fig. 10 exhibits the locations of the stations. It displays the differences between the MACC and AERONET AOD550 expressed as the RMSE shown in different colors. The size of the disc over each station is proportional to the mean AOD550 at that location. The mean AOD550 ranges from 0.3 to 1.0, and is 0.4 at most locations. The RMSE ranges from 0.08 to 0.28 and is between 0.12 and 0.20 for most stations. The relative RMSE ranges between 20% and 100%. MACC overestimates the AOD550 at each station.
tion; the bias ranges from 0.05 to 0.25. The relative bias is low for most stations: between 10% and 20% for 10 of the 16 stations, but it can be very high (i.e. 80% at one station). The correlation coefficient is relatively high at all stations. It is greater than 0.7 for 14 of the 16 stations, which shows that MACC reproduces satisfactorily the temporal variability of the AOD 550.

The above findings add evidence to the already reported overestimation of the MACC AOD 550 with respect the AERONET observations over the region of the UAE (Benedictow et al., 2014; Oumbe et al., 2013). The positive bias at latitudes close to that of the UAE is attributed to major dust sources, sulfate and organic matter. This is not a global bias; the bias in the MACC AOD 550 depends on the region (Benedictow et al., 2014).

Over the UAE, the overall comparison between MACC AOD 550 and AERONET AOD 550 is shown in the scatter density plot in Fig. 11. Generally there is a high overestimation in the MACC AOD 550, where the relative bias is +27%. The overall coefficient of determination is 0.634 and the relative RMSE is high at 48%. These deviations may lead to significant errors in the McClear estimated irradiances.

Oumbe et al. (2012a) computed the time series of the GHI and the DNI at each AERONET station using the radiative transfer model libRadtran: once with the AERONET computed AOD 550 and once with the MACC AOD 550. The comparison between the resulting irradiances gives an estimate on the errors in McClear irradiances that can be attributed to the MACC AOD 550. Using the irradiances computed with the AERONET AOD 550 as the references, they found that errors are low for the GHI (relative bias of −3% and relative RMSE of 5%), but significantly higher for the DNI (relative bias of −12% and relative RMSE of 20%). They concluded that one main source of the errors in McClear originates from the MACC AOD in agreement with the present article.

In the framework of the PREDISOL project, MACC AODs have been identified as the most appropriate aerosol data sets for irradiance estimations in the UAE (Oumbe et al., 2013). They are provided with a relatively high temporal frequency at 3 h– and date back to 2004 and will be long-term maintained, as part of an EU-funded project. Compared to the Model of Atmospheric Transport and Chemistry (MATCH, Collins et al., 2001), another high frequency and global AOD data set, the MACC AODs exhibit a relatively lower deviation when compared to AERONET measurements (Schroedter-Homscheidt and Oumbe, 2013). Only MACC and MATCH were tested over the UAE during the time span of PREDISOL, therefore more research is necessary to assess the performance of other chemical transport models over this region.
4.2. Comparisons with other modelled irradiances for cloud-free conditions

McClear is now compared against two models from the literature predicting irradiances under cloud-free skies in order to further evaluate its performance over the UAE. The first one is the clear sky model of the European Solar Radiation Atlas (ESRA), which is used in the Heliosat-2 model (Rigollier et al., 2000). This model is an empirical one, based on a database of climatological monthly means of Linke turbidity. The GHI from the ESRA model is available in the HelioClim-3v4 (HC3v4) database (Blanc

Table 6
Validations of cloud-free global horizontal irradiances by E-ANN, HC3v4 and McClear. Overall is for all measurements from all stations combined.

<table>
<thead>
<tr>
<th>Station</th>
<th>Model</th>
<th># of samples</th>
<th>Mean GHI [W m⁻²]</th>
<th>Bias [W m⁻²]</th>
<th>RMSE [W m⁻²]</th>
<th>R² %</th>
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<td>71</td>
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Table 7
Validations of cloud-free direct normal irradiances by E-ANN, HC3v4 and McClear. Overall is for all measurements from all stations combined.

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<th>Station</th>
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et al., 2011). The other model is the ensemble artificial neural network (E-ANN) model, which is a statistical model utilizing the Meteosat Second Generation images for irradiance prediction specifically over the region of the UAE (Eissa et al., 2013). The E-ANN model does not require any aerosol information, but it does require a training beforehand. In this case it was trained using the same training set used by Eissa et al. made of observations in three stations for the year 2010 in the UAE. These two models have been selected because on the one hand, HelioClim-3 is available as a service like McClear and is widely used and known, and on the other hand, the E-ANN model has been specifically developed for the UAE and should offer high performances.

The validation results of those two models are presented for the year 2012 for the seven stations. Ideally there should be an equal number of samples at each of the seven stations. However, the number of validation samples from the E-ANN model is less than those of McClear and HC3v4. There were some gaps in the downloaded Meteosat images, with the most significant being from 12/09/2012 to 27/10/2012. A fair comparison between McClear and HC3v4, and an indication on where the E-ANN model stands with respect to the other two models, is provided herein.

The validation results of the GHI and DNI for the seven stations are respectively presented in Tables 6 and 7. McClear exhibits better statistical indicators in GHI for
AR, EJH, MZ_{bertin} and WA stations, while HC3v4 performs better for MasdC, MZ_{masd} and SW stations. The E-ANN model exhibits the lowest performance. In addition to Figs. 2 and 6, the scatter density plots of the GHI are shown in Fig. 12 (HC3v4 AR), Fig. 13 (HC3v4 MasdC), Fig. 14 (E-ANN AR) and Fig. 15 (E-ANN MasdC). The scatter around the 1:1 line is small in all figures with a negative bias present over AR for all three models. For MasdC, the relative bias for HC3v4 is low (+1%), while it is more significant for the E-ANN model (−6%) and McClear (+6%). The errors of the three models are reasonable, given the uncertainty of the RSI instrument.

For the validations of the DNI, performance of McClear is always better in terms of $R^2$ and relative RMSE. HC3v4 exhibits the best relative bias for five stations (AR, MZ_{bertin}, MZ_{masd}, SW and WA). The scatter density plots are shown in Fig. 16 (HC3v4 AR), Fig. 17 (HC3v4 MasdC), Fig. 18 (E-ANN AR) and Fig. 19 (E-ANN MasdC).

Even though the GHI estimates from McClear and HC3v4 exhibit similar results—for all stations combined: relative RMSE of 5% for both models, relative bias of −2% and +2% respectively for HC3v4 and McClear, $R^2$ of 0.988 and 0.982,—the differences are more pronounced in the DNI—for all stations combined: relative RMSE of 13% and 11% respectively, relative bias of +2% and −4%, $R^2$ of 0.734 and 0.837. The higher scatter of samples around the 1:1 line shown in Figs. 16 and 17, as opposed to...
those shown in Figs. 3 and 7, can be attributed to the climatological monthly means of the Linke turbidity used in the ESRA model. This suggests that the temporal variation of the McClear DNI is well-reproduced by the 3 hourly time series of the AOD from MACC.

5. Conclusion

This first validation of the McClear model for the specific climate of the United Arab Emirates, where skies are frequently cloud-free but turbid, reveals very satisfactory results as a fast look-up-table-based implementation of a radiative transfer model for the direct and global irradiances. The comparisons between the McClear estimates and measurements of global horizontal and direct normal irradiances for 7 stations show that a large correlation is attained. For 10 min averages of the global horizontal irradiance, the coefficient of determination ranges from 0.980 to 0.990. The bias comprises between −9 W m$^{-2}$ (−1%) and +35 W m$^{-2}$ (+6%), and the RMSE between 22 W m$^{-2}$ (4%) to 47 W m$^{-2}$ (8%). For the direct normal irradiance, the coefficient of determination ranges from 0.830 to 0.863. The bias comprises between −57 W m$^{-2}$ (−8%) and +6 W m$^{-2}$ (+1%), and the RMSE between 62 W m$^{-2}$ (9%) to 87 W m$^{-2}$ (13%). The large coefficient of determination and the low standard deviation, computed from the RMSE and bias, demonstrate that McClear offers accurate estimates of the changes of the surface solar irradiance in time.

Comparisons with other models from the literature show that McClear offers similar or better performances. Nevertheless, performances are still far from WMO standards: bias less than 3 W m$^{-2}$ and 95% of the deviations less than 20 W m$^{-2}$ (WMO, 2010). There is still room for improving the McClear irradiance estimates, mainly for the direct irradiance component which is underestimated for six of the seven stations. This could be done by improving, at least locally, the MACC-derived aerosol properties and adding more information on the circumsolar radiation.

Work is in progress to estimate the circumsolar radiation in an efficient manner for given atmospheric conditions (Blanc et al., 2014a; Eissa et al., 2014). Incorporating knowledge on the circumsolar radiation in McClear would improve the quality of the assessments, particularly for the concentrating solar technologies, i.e. concentrated photovoltaic and concentrated solar thermal electric systems.

Acknowledgments

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References


