Variability of adjacency effects in sky reflectance measurements

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Sky reflectance \( R_{\text{sky}}(\lambda) \) is used to correct in situ reflectance measurements in the remote detection of water colour. We analysed the directional and spectral variability in \( R_{\text{sky}}(\lambda) \) due to adjacency effects against an atmospheric radiance model. The analysis is based on one year of semi-continuous \( R_{\text{sky}}(\lambda) \) observations that were recorded in two azimuth directions. Adjacency effects contributed to \( R_{\text{sky}}(\lambda) \) dependent on season and viewing angle, and predominantly in the near-infrared (NIR). For our test area, adjacency effects spectrally resembled a generic vegetation spectrum. The adjacency effect was weakly dependent on the magnitude of Rayleigh- and aerosol-scattered radiance. Reflectance differed between viewing directions 5.4 ± 6.3% for adjacency effects and 21.0 ± 19.8% for Rayleigh- and aerosol-scattered \( R_{\text{sky}}(\lambda) \), in the NIR. It is discussed under which conditions in situ water reflectance observations require dedicated correction for adjacency effects. We provide an open source implementation of our method to aid identification of such conditions. © 2017 Optical Society of America

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Coastal and inland water bodies are challenging targets for satellite remote sensing compared to the open ocean, due to higher optical complexity of water and atmosphere, small spatial footprints, and adjacency effects [1]. Adjacent land can increase the remotely sensed water leaving radiance signal when contrasts are present in ground albedo \( r_g(\lambda) \), i.e. the fraction of global incident solar irradiance that is reflected back into space [2]. Adjacency effects are negligible for most open-ocean environments due to low \( r_g(\lambda) \) contrasts at sea [3]. Land cover (e.g. vegetation, ice/snow, roads) reflectance typically exceeds that of water by an order of magnitude and may thus be expected to contribute to downwelling irradiance and observed water-leaving radiance as the result of (multiple-) scattering processes in the atmosphere [4].

Various adjacency correction approaches exist for satellite or airborne remote sensing observations for water close to land [e.g. 5-7]. Calibration and validation of the adjacency correction rely heavily on in situ reference measurements, such as remote sensing reflectance \( R_{\text{rs}}(\lambda) \). \( R_{\text{rs}}(\lambda) \) is defined as the ratio of water leaving radiance \( L_w(\lambda) \) to downwelling irradiance \( E_d(\lambda) \). For isotropic (Lambertian) reflection, normalization with \( E_d(\lambda) \) at water surface level should account for any adjacency components in the light field [8]. However, \( L_w(\lambda) \) cannot be observed directly from above the water due to reflections at the surface [9]. A common approach to derive \( L_w(\lambda) \) from upwelling radiance \( L_u(\lambda) \) is to subtract a fraction \( \rho \) of sky radiance \( L_{\text{sky}}(\lambda) \) in specular direction of the sea-viewing sensor [10]:

\[
R_{\text{rs}}(\lambda) = \frac{L_u(\lambda)}{E_d(\lambda)} - \rho \frac{L_{\text{sky}}(\lambda)}{E_d(\lambda)}.
\]

Radiance sensor azimuth angles are assumed equal, with zenith angles mirrored in the horizontal plane. In the following we focus on the correction term, \( L_{\text{sky}}(\lambda) / E_d(\lambda) \), which is referred to as sky reflectance \( R_{\text{sky}}(\lambda) \). Natural water surfaces are wind-roughened and therefore reflect radiance also from outside the \( L_{\text{sky}}(\lambda) \) sensor field-of-view [e.g. 10, Fig. 2]. A measurement of \( L_{\text{sky}}(\lambda) \) is thus geometrically not representative of the radiance reflected at a wind-roughened water surface. As long as reflected radiance is spectrally equivalent to measured \( L_{\text{sky}}(\lambda) \), \( R_{\text{rs}}(\lambda) \) can still be accurately derived with eq. (1) and a suitable choice for \( \rho \) [e.g. 11, 12]. If this is not the case, spectrally variable contributions to \( L_u(\lambda) \) by sun and sky glint (Rayleigh- or aerosol-scattered) may be accounted for with bio-optical modelling [e.g. 13]. The adjacency component of the downwelling light field depends on \( r_g(\lambda) \), atmospheric composition, illumination conditions, and viewing geometry [14, 15] and is expected to be variable in intensity and spectral shape, for different viewing angles. To date, no methodology is available to identify in situ
reflectance measurements that are contaminated by adjacency effects.

In this letter, we assess directional and spectral variability in \( R_{s,k} (\lambda) \) due to the adjacency effect against an atmospheric model. The model is used to partition \( R_{s,k} (\lambda) \) into two components: sky reflectance that has not interacted with ground cover, and sky reflectance due to adjacency effects. The procedure was applied to one year of semi-continuous \( R_{s,k} (\lambda) \) observations recorded in two azimuth directions, to assess the spatio-temporal variability of each component. Subsequently, \( r_g (\lambda) \) of the sensor environment was derived to assess spectral variability.

Semi-continuous measurements were recorded with a fixed-position reflectance instrument in the eutrophic Lake Paterswolde (Paterswoldsemeer, the Netherlands, 53.1631°N, 6.5773°E). Trees and fields surrounded the southern part of the lake where the instrument was located, with the city of Groningen to the North. The nearest vegetation was located approximately 50 m away from the sensors. The instrument carried two sets of inter-calibrated \( L_u (\lambda, \theta_{view}, \phi), L_{s,k} (\lambda, \theta_{view}, \phi), \) and \( E_{d,\lambda} (\lambda) \) channels (400-880 nm), with azimuth angles \( \phi \) pointing north-northeast (NNE) and north-westnorth (NNW), respectively. Viewing zenith angles \( \theta_{view}, \theta_{wv} \) of sky and upwelling radiance sensors were fixed at 40° from zenith and nadir, respectively. The instrument was deployed from 5 September 2015 until 3 October 2016, excluding November to January. During the deployment, clear sky conditions between 9 and 15 h local time occurred for at least one measurement on 229 days and 4542 observations in total. The sky was considered clear if \( L_{s,k} / E_d (750 nm) < 0.05 \) [11] in both azimuthal viewing directions. We did not consider variability in \( L_u (\lambda) \) in this analysis.

We utilize an analytical parametrisation of downwelling radiation by [3] that was spectrally expanded by [16], further referred to as GC90. The model describes \( E_d (\lambda) \) as the sum of direct \( E_{d,d} (\lambda) \) and diffuse \( E_{d,s} (\lambda) \) irradiance, with the latter composed of Rayleigh- and aerosol-scattered irradiances (\( E_{d,s,\lambda} (\lambda) \) and \( E_{d,a} (\lambda) \), respectively). The influence of clouds on \( E_d (\lambda) \) is not included. GC90 is based on earlier work by [17], modified to yield irradiances typically observed under maritime atmospheres, where adjacency effects may safely be ignored. This assumption may not be valid for measurements in lakes or coastal areas. Hence we adapted adjacency irradiance \( E_{d,a} (\lambda) \), as formulated by [17], for use with GC90. It is assumed that a fraction \( n_s (\lambda) \) of \( E_d (\lambda) \) is reflected at the ground, and subjected to Rayleigh- and aerosol scattering that return a fraction \( r_s (\lambda) \) (sky reflectivity) towards a sky-viewing observer [17]:

\[
E_{d,a} (\lambda) = E_d (\lambda) n_s (\lambda) r_s (\lambda) \times \left[ 1 - \left( r_s (\lambda) n_s (\lambda) \right) \right]^{-1}.
\]

Sky reflectivity is calculated based on atmospheric transmission coefficients and aerosol forward scattering probability \( F_a \):

\[
r_s (\lambda) = T_s (\lambda) T_{wr} (\lambda) T_{da} (\lambda) \times \left[ 0.5 \left( 1 - T_s (\lambda) \right) + \left( 1 - F_a \right) T_s (\lambda) \left( 1 - T_{da} (\lambda) \right) \right],
\]

with reduced transmission due to oxygen absorption \( T_s (\lambda) \), water vapour absorption \( T_{wr} (\lambda) \), aerosol absorption \( T_{da} (\lambda) \), Rayleigh-scattering \( T_s (\lambda) \), and aerosol scattering \( T_{da} (\lambda) \). A factor \( \pi^{-1} \) is assumed to express modelled irradiances in units of radiance. Modelled sky reflectance \( R_{s,k} (\lambda) \) is thus calculated as:

\[
R_{s,k} (\lambda) = \frac{f_{dsr} L_{dsr} (\lambda) + f_{dsr} L_{dlsa} (\lambda) + f_{dsk} L_{dsk} (\lambda)}{E_{dsr} (\lambda) + E_{dsr} (\lambda) + E_{dsla} (\lambda) + E_{dsk} (\lambda)},
\]

with scaling factors \( f \) and radiances \( L \) for Rayleigh- \((d_{sr})\), aerosol- \((d_{s,a})\), and adjacency-scattering \((d_{s,k})\), respectively. Further detail on the calculation of these parameters is given in [3], [17], and [16]. Least-squares minimization (bounded Nelder-Mead) of the residual-sum-of-squares (RSS) between observed \( R_{s,k} (\lambda) \) and modelled \( R_{s,k}^m (\lambda) \),

\[
RSS = \sum \left( R_{s,k} (\lambda_i) - R_{s,k}^m (\lambda_i) \right)^2 \times W(\lambda_i),
\]

was carried out with bounded parameters as listed in Table 1, air mass type fixed to 1, standard atmospheric pressure of 1013.25 mbar, relative humidity of 60 %, ozone scale height of 0.3 cm, water vapour scale height of 2.5 cm, and weighting vector \( W(\lambda) = 1 \). A fit was regarded successful if \( RSS < 0.01 \) \( sr^{-1} \), which was the case for 4404 of 4542 observations. The ‘lawn/’grass’ spectrum from the SMARTS2 model [18] gave the lowest average RSS and was used as reference \( r_g (\lambda) \) in further calculations (see Fig. 3, \( r_g^{grass} \)).

Table 1. Average (mean) fit results and standard deviations (4404 fits) for bounded model parameters: Rayleigh-scattering irradiance factor \( f_{dsr} \), aerosol-scattering irradiance factor \( f_{dsr} \), adjacency irradiance factor \( f_{dsk} \), Ångström exponent \( a \), turbidity coefficient \( \beta \). Optimization was carried out with and without taking adjacency effects into account, and resulted in normalized root-mean-square deviations (NRMSD).

<table>
<thead>
<tr>
<th>Param.</th>
<th>Start (bounds)</th>
<th>No adjacency</th>
<th>With adjacency</th>
</tr>
</thead>
<tbody>
<tr>
<td>( f_{dsr} ) [-]</td>
<td>1 (0-10)</td>
<td>0.80 ± 0.12</td>
<td>0.80 ± 0.13</td>
</tr>
<tr>
<td>( f_{dsr} ) [-]</td>
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<td>1.80 ± 2.33</td>
<td>0.98 ± 1.77</td>
</tr>
<tr>
<td>( f_{dsk} ) [-]</td>
<td>1 (0-10)</td>
<td>-</td>
<td>0.62 ± 0.28</td>
</tr>
<tr>
<td>( a ) [-]</td>
<td>1 (0-3)</td>
<td>1.64 ± 0.65</td>
<td>1.30 ± 0.65</td>
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<tr>
<td>( \beta ) [-]</td>
<td>0.05 (0-1)</td>
<td>0.08 ± 0.13</td>
<td>0.17 ± 0.22</td>
</tr>
<tr>
<td>NRMSD_1 [%]</td>
<td>7.13 ± 2.87</td>
<td>1.29 ± 0.29</td>
<td></td>
</tr>
</tbody>
</table>

Fig. 1. Fit curve, diffuse \( (L_{dsr} (\lambda) + L_{dsla} (\lambda)) / E_d (\lambda) \) and adjacency \( L_{dsk} (\lambda) / E_d (\lambda) \) sky reflectance components, and residual spectrum \( R_{resid} (\lambda) \), derived from model optimization to a \( L_{s,k} (\lambda) / E_d (\lambda) \) observation.

\( R_{s,k} (\lambda) \) is representative of molecular Rayleigh- and aerosol-scattered light and contains no atmospheric absorption features [19], if recorded under clear sky conditions and in absence of adjacency effects. Reflectance of vegetation is typically low for
wavelengths below approximately 680 nm from where it rises steeply – the so-called red edge of vegetation [20]. This was exploited to compare model performance with, and without taking adjacency effects into account. For the latter, RSS was minimized in the spectral region 400 to 680 nm (weighting vector $W(\lambda > 680 \text{nm}) = 0$, 1 elsewhere) and $f_{\text{dsg}} = 0$ (for all bounded parameters, see Table 1).

Figure 1 shows model fit results for a typical summer observation of $R_{\text{sky}}(\lambda)$ above Paterswoldsemeeer. The fit curve is almost indistinguishable from the $L_{\text{sky}}/E_d$ observation (normalized root-mean-square deviation NRMSD of 0.97 %), also in the near-infrared (NIR) spectral bands above 680 nm where adjacency effects due to vegetation are expected, and around the oxygen A-band rotational absorption lines near 762 nm. Model optimization in the 400-680 nm spectral region and without correcting for adjacency effects resulted in a NRMSD of 6.8 % (400-880 nm). However, Rayleigh- and aerosol-scattered reflectance matches the $L_{\text{sky}}/E_d$ observation well up to approximately 680 nm, supporting that adjacency effects predominantly affected the NIR bands for our test data. Model fits (with and without accounting for adjacency effects) were repeated for all sky reflectances in the data set, and parameter results are summarized in Table 1. Accounting for adjacency effects reduced average NRMSD more than five-fold. Variability of $f_{\text{dsg}}$ suggests strong seasonality: in February, $f_{\text{dsg}}$ averaged lowest to 0.35 ± 0.16 (NNE) and 0.34 ± 0.15 (NNW), compared to maximum values in June of 0.91 ± 0.30 (NNE) and 0.87 ± 0.26 (NNW). Figure 2 shows that NNE- and NNW-pointing channels differed more strongly in terms of Rayleigh- and aerosol contributions than adjacency effects. The ratio $L_{\text{dsg}}(\lambda)/[L_{\text{dsg}}(\lambda) + L_{\text{dsa}}(\lambda)]$ averaged 0.13 ± 0.14 and was less pronounced in the visible spectral range (0.04 ± 0.01, 400-680 nm) compared to the NIR (0.26 ± 0.13, 680-880 nm). When compared to observed $R_{\text{sky}}(\lambda)$, directional reflectance differences in the NIR averaged to 5.4 ± 6.3% (adjacency) and 21.0 ± 19.8% (Rayleigh- and aerosol-scattered). Weak correlations were found between $f_{\text{dfr}}$ and $f_{\text{dsg}}$ ($R^2 < 0.20$, $p < 0.05$, both directions), $f_{\text{dsa}}$ and $f_{\text{dsg}}$ ($R^2 < 0.07$, $p < 0.05$, both directions), and between viewing directions for $f_{\text{dsg}}$ ($R^2 = 0.42$, $p < 0.05$).

It is concluded that adjacency effects in this study contributed to observed $R_{\text{sky}}(\lambda)$ a) dependent on season and viewing angle, b) predominantly in the NIR, c) and weakly dependent on Rayleigh- and aerosol-scattered reflectance.

Thus far, $r_g(\lambda)$ was approximated by scaling a constant vegetation reference albedo from literature. From above, it is obvious that this scaling will be spatiotemporally variable. We subsequently investigated whether $r_g(\lambda)$ was variable not only in magnitude but also in spectral shape. Based on b), adjacency effects were ignored in a second round of model fits that excluded the NIR spectral range. Corresponding residual spectra $R_{\text{resid}}(\lambda)$,

$$R_{\text{resid}}(\lambda) = \frac{L_{\text{sky}}(\lambda)}{E_d(\lambda)} - \frac{L_m^m(\lambda)}{E_d^m(\lambda)},$$

over the complete spectral range (400-880 nm) were thus assumed to be exclusively caused by adjacency effects. This assumption allowed to solve eq. (4) for spectral ground albedo $r_g(\lambda)$:

$$r_g(\lambda) \approx \frac{\pi}{f_{\text{dsg}}} \times \frac{R_{\text{resid}}(\lambda)}{r_g(\lambda)}.$$  

Equation 7 was applied to all $R_{\text{resid}}(\lambda)$ to calculate $r_g(\lambda)$ for the whole data set. Residual absorption features in derived $r_g(\lambda)$ due to modelling imperfections of water vapour absorption (710 - 735 nm and 805 - 840 nm) and oxygen absorption (755 - 770 nm) were removed and linearly interpolated before smoothing with a Hamming window of 50 nm width, while residuals due to comparatively weak and broad ozone absorption were not corrected for. Derived $r_g(\lambda)$ also accounted for scaling effects, thus $f_{\text{dsg}}$ was fixed to 1. $R_{\text{resid}}(\lambda)$ may be negative for some bands, which would lead to negative values for $r_g(\lambda)$. Since no information about absolute reflectance contrasts was available, $r_g(\lambda)$ spectra were shifted such that they became non-negative throughout the covered spectral range. An example of resulting $r_g(\lambda)$ is depicted in Fig. 3 and monthly averages are shown in Fig. 4. Ground albedo magnitude followed the seasonal vegetation cycle, with lower values in late autumn and early spring, and highest values in summer. This resembles variability in $f_{\text{dsg}}$, that was derived from model optimization with a fixed reference ground albedo. Mean $r_g(\text{NIR})$ varied by 66.9 % (NNE) and 64.2 % (NNW) (relative standard deviation). After removing scaling variability (division by mean), spectral variability in $r_g(\text{NIR})$ of 13.4 ± 7.8 % (NNE) and 14.6 ± 8.5 % (NNW) (mean relative standard deviation) remained. Mean $r_g(\text{NIR})$ differed (absolute differences) between NNE and NNW on average by 0.17 ± 0.21 for individual observations, 0.12 ± 0.15 for daily averages, and 0.02 ± 0.01 for monthly averages. Spectral shapes of derived ground albedo generally resembled that of $r_g^{\text{Grass}}(\lambda)$, though with albedo peak wavelength migrating from approximately 820 nm in spring and autumn to approximately 870 nm in summer.

In summary, short-term and seasonal variability in $R_{\text{sky}}(\lambda)$...
Optics Letters 4

Fig. 4. Monthly averaged spectral ground albedos for azimuth directions NNE (left panel) and NNW (middle panel), and their average values in the 680-880 nm spectral range (right panel, error bars depict standard deviations).

due to adjacency effects were dominated by amplitude rather than spectral variation. Adjacency effect directionality is apparent from systematic amplitude differences in adjacency radiance towards NNE and NNW, and is further indicated by weak correlations between \( f_{\text{dsg}} \) for these directions. Adjacency effects contributed primarily to the \( R_{\text{sky}}(\lambda) \) variability in the NIR, where accurate reflectance references are crucial for atmospheric correction and quality control of water-leaving radiance [11]. These results support that illumination conditions have a noticeable effect on apparent spectral ground albedo, e.g. due to inhomogeneous bidirectional reflectance distribution functions (BRDFs) of surrounding vegetation [15]. Models for these complex interactions [e.g. 15] could augment approximated \( r_g(\lambda) \) spectra, e.g. when adjacency effects are not confined to the NIR or by providing realistic reflectance offsets. A spectrally constant reference albedo (here: \( r_{\text{grass}}^{\text{sky}}(\lambda) \)) is considered sufficient to model adjacency effects in the context of correction for water surface reflections.

Combined directional variability of Rayleigh- and aerosol-scattered sky light and adjacency effects averaged more than 26 % of observed \( R_{\text{sky}}(\lambda) \) for the analysed data set in the NIR. Wind-roughened water surfaces regularly reflect light also from directions between \( f_{\text{dsg}} \) for these directions.

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REFERENCES

FULL REFERENCES


