Author responses to review of Referee #1 of Biogeosciences manuscript bg-2019-70 "Dissolved Organic Matter at the Fluvial-Marine Transition in the Laptev Sea Using in situ Data and Ocean Color Remote Sensing "

by Bennet Juhls, Pier Paul Overduin, Jens Hölemann, Martin Hieronymi, Atsushi Matsuoka, Birgit Heim, Jürgen Fischer

We are very grateful to the anonymous reviewer for the detailed and valuable comments on our manuscript. We are confident that the constructive review and suggestions have contributed to improve the paper during our revisions.

Reviewer comments and our responses are presented below.

Reviewer comments are given in *italic font*, our response in blue regular font and the resulting change in the manuscript in *blue italic*.

## Anonymous Referee #1,

## **GENERAL COMMENTS:**

"The manuscript addresses a relevant scientific issue: sources of dissolved organic matter and carbon cycle in the fluvial-marine transition zone of the Arctic Ocean. The database collected in situ is robust and collaborates to expand knowledge of the sources and processes that occur in the study region, as well as to expand the database. The tests of the various ocean color algorithms show the possibilities of method application and point to certain deficiencies that arise from the available atmospheric correction algorithms dedicated to the satellite image processing.

The estimation of the dissolved organic carbon using satellites images and the empirical algorithm developed by the authors significantly increases the possibility of exploration of ocean color data in the study area, giving the manuscript a substantial contribution to scientific progress within the scope of Biogeosciences.

The method used for DOC estimation was correctly addressed and the results were discussed in an appropriate manner, with figures, tables and graphs presented in a clear, concise and well structured manner. The results are sufficient to support the interpretations and conclusions. The manuscript has the desired scientific quality and follows unrestricted, except minor issues pointed out below."

We are very glad about these positive comments on our manuscript. We revised our manuscript according to the specific comments below.

## **SPECIFIC COMMENTS:**

"Page 1 Line 15: inset point "." after "Laptev Sea" "
This has been changed accordingly in the text.

"Page 1 Line 16: change "DOM" to "dissolved organic matter (DOM)""
This has been changed accordingly in the text.

"Page 2 Line 2: change "dissolved organic matter (DOM)" to "DOM""
This has been changed accordingly in the text.

"Page 2 Line 10: change "dissolved organic carbon (DOC)" to "DOC""
This has been changed accordingly in the text.

"Page 2 Line 24: change "Ocean Color Remote Sensing (OCRS)" to "OCRS"" This has been changed accordingly in the text.

**"Page 3** Line 31: the first table to be quoted in the paper is table 2, instead of being table 1, please rename the tables so that the first table to be quoted is table 1. "

Thank you for this comment, the table number 1 and 2 has been changed and all references have been changed accordingly.

"Page 4 Line 9: please, see observation above (Page 3 – Line 31)" This has been changed (see above).

"Page 4 Line 31: please inform whether the cuvette is quartz or not"

We used quartz cuvettes for our absorbance measurements. We changed the text in the manuscript accordingly:

"The quartz cuvette length varied depending on the expected absorption in the sampled water"

"Page 5 Line 3: please, insert a bibliographical reference that contextualizes the equation 2: "fitting the following equation (bibliographic reference):" "

We inserted two references (Jerlov 1968; Bricaud et al. 1981):

"Spectral slopes of  $a_{CDOM}(\lambda)$  were calculated by non-linearly fitting the following equation (Jerlov, 1969; Bricaud et al., 1981)"

"Page 5 Line 7: change "a\*CDOM(440)=aCDOM(440)/DOC)." To "a\*CDOM(440)=aCDOM(440)/DOC." "

This has been changed accordingly in the text.

**"Page 5** Line 12: after "high spectral resolution and spectroradiometric quality" insert a bibliographical reference"

We inserted Delwart et al. (2007) as a reference:

"For this study, we chose the Medium Resolution Imaging Spectrometer (MERIS) because of its high spectral resolution and spectroradiometric quality (Delwart et al., 2007)"

## "Page 5 Line 13: Why was not used MERIS Full resolution images (300 m)???"

We used MERIS reduced resolution (RR) data because the signal to noise ratio (SNR) of MERIS RR is higher than that of MERIS full resolution (FR) and, thus, the use of RR data for water applications is recommended (Hu et al., 2012). Figure 1 (of this response letter) shows the comparison of MERIS FR (Fig. 1a) and MERIS RR (Fig. 1b) for the region of interest in this study. MERIS FR scene is characterized by a higher noise and thus the risk of extracting noisy pixel is high.

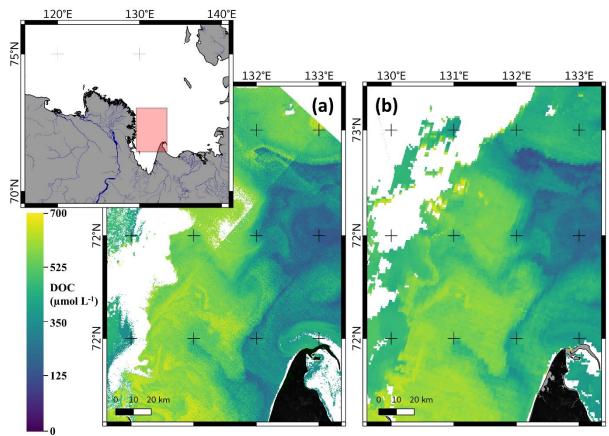


Figure 1: (a) DOC concentration retrieved from MERIS FR scene from 3<sup>rd</sup> August 2010 and (b) from MERIS RR scene.

Furthermore, our study investigates large areas (Laptev Sea shelf) and large-scale features as the Lena River plume (> 300 km). Since no small-scale features are of special interest in this study, we preferred to use the RR data because of its larger coverage and higher quality compared to MERIS FR. The relationship between in situ DOC and ONNS-derived DOC using FR data was slightly stronger ( $r^2$ =0.68) compared to RR data ( $r^2$ =0.53).

We added the following explanation to the manuscript:

"Scenes with reduced resolution were chosen because of their larger extent and thus better coverage of the in situ data stations. Furthermore, Hu et al., (2012) reported a better signal to noise ratio of MERIS reduced resolution compared to MERIS full resolution data and recommended the use of MERIS reduced resolution data."

We added following information to section 3.5.1:

"The use of MERIS full resolution data revealed a slightly better performance ( $r^2$ =0.68, slope=0.77). However, we preferred the use of reduced resolution data due to the reported better quality (Hu et al., 2012)."

**"Page 5** Line 20: please, explain what was the extraction window dimension (for instance, window of 3 x 3 pixels centered at the sampling points for Rrs median value)"

Thank you for pointing out this missing information. We indeed extracted 3 by 3 pixels of each OCRS product following e.g. Müller et al., 2015 and used the median value for the comparison in chapter 3.4 and 3.5.1. We inserted an additional sentence, which provides this information:

"To compare in situ with satellite data, we used the median of 3 by 3 extracted pixel values from each single processed OCRS image"

"Page 7 Line 6: change "and 1.17 to 7.91 m-1 aCDOM(443)" to "and 1.17 to 7.91 m-1" "This has been changed accordingly in the text.

"Page 7 Line 9: change "from to 0.077" to "from 0.077" "This has been changed accordingly in the text.

**"Page** 7 Line 18: change "from river to offshore." to "from river to offshore (Fig. 2)." "This has been changed accordingly in the text.

"Page 7 Line 25: please, inform what type of correlation (Pearson or Spearman or ....) was used. It may be better to insert in the paragraph "2.3.1 Functions for satellite retrieval evaluation" a paragraph mentioning the type of correlation used in the statistical analyzes. "

In this line we used the coefficient of determination (r<sup>2</sup>) to show the goodness of the presented linear fit (red dashed line, Fig. 3). We added this information to the manuscript:

"As in other river-influenced waters, there was a strong linear relationship between  $a_{CDOM}(443)$  and salinity ( $r^2$ =0.87, n=283) (Fig. 3), suggesting that physical mixing prevails and plays a role in near-conservative behavior of  $a_{CDOM}(\lambda)$ .

Page 8 Line 2: the same situation as Line 25, Page 7. Please, see the above comment.

In cases where we wanted to show the correlation between two variables without fitting a model, we used Pearson correlation coefficient (r) (e.g. Fig 4). We edited the text accordingly: "The strongest correlation was observed between  $a_{CDOM}(443)$  and the UV slope S275-295 (Fig. 4a, Pearson correlation coefficient (r) =-0.84)."

**Page 8** Line 8: change "Nelson and Siegel, (2002) indicating..." to "Nelson and Siegel (2002), dashed lines in Figure 4c, indicating..."

This has been changed accordingly in the text.

**Page 8** Line 9: please, insert bibliographic reference after "higher aromaticity (bibliographic reference)"

The a\*cdom (DOC normalized absorption) is a parameter similar to SUVA (DOC normalized absorbance). We added references, which use the slope (Granskog et al., 2012; Helms et al., 2008) as well as references, which use SUVA (Weishaar et al., 2003) as an indicator of aromaticity: "Most samples from this study are located below the  $a*_{CDOM}(440)$  limits of oceanic water reported by Nelson and Siegel (2002), dashed lines in Figure 4c, indicating that water samples from this study are

Nelson and Siegel (2002), dashed lines in Figure 4c, indicating that water samples from this study ar primarily river influenced with higher aromaticity (Granskog et al., 2012; Helms et al., 2008; Weishaar et al., 2003)"

Page 8 Line 10: change "from (Matsuoka et al., 2012) deviates..." to "from (Matsuoka et al., 2012), solid line in Figure 4c, deviates..."

This has been changed accordingly in the text.

Page 9 Line 18: I didn't find "Fig.11, A2"

Thank you for pointing out this mistake. The text has been changed to Fig. B1.

**Page 10** Line 7: change "...DOC concentrations using..." to "...DOC concentrations (Fig. 8) using..."

This has been changed accordingly in the text.

**Page 10** Line 8: change "...the presented DOC-aCDOM( $\lambda$ ) model (Fig.8) and..." to "...the presented DOC-aCDOM( $\lambda$ ) model (Eq. 7) and..."

This has been changed accordingly in the text.

**Page 10** Line 24: change "...function of salinity, indicating...." To "...function of salinity (Fig 3), indicating..."

This has been changed accordingly in the text.

Page 10 Line 25: delete "(Fig. 3)"

This has been changed accordingly in the text.

**Page 11** Line 12: please, insert a bibliographic reference here "... which is often used in the OCRS community (bibliographic reference),..."

We added bibliographic references from Babin et al. (2003) and Matsuoka et al. (2011, 2012): "Here we use S350-500, which is often used in the OCRS community (Babin et al., 2003; Matsuoka et al., 2011, 2012), instead of S350-400, which is the wavelength range suggested by Helms et al. (2008)."

Page 13 Line 14: this acronym was quoted for the first time "TSM"??? Please, write out the full text "total suspended matter (TSM) ..."

The acronym was now introduced in section 2.3.

Page 13 Line 17: I didn't find "Fig. 11b" Has been changed to "9b"

Page 14 Line 2: change "low" to "lower"
This has been changed accordingly in the text.

Page 14 Line 13: I didn't find "Fig 12b" Has been changed to "Fig. 10"

Author responses to review of Referee Piotr Kowalczuk of Biogeosciences manuscript bg-2019-70 "Dissolved Organic Matter at the Fluvial-Marine Transition in the Laptev Sea Using in situ Data and Ocean Color Remote Sensing"

by Bennet Juhls, Pier Paul Overduin, Jens Hölemann, Martin Hieronymi, Atsushi Matsuoka, Birgit Heim, Jürgen Fischer

We are very grateful to the reviewer Dr. Piotr Kowalczuk for the detailed and valuable comments on our manuscript. We are confident that the constructive review and suggestions have contributed to improve the paper during our revisions.

Reviewer comments and our responses are presented below.

Reviewer comments are given in *italic font*, our response in blue regular font and the resulting change in the manuscript in *blue italic*.

## Referee Piotr Kowalczuk,

## **GENERAL COMMENTS:**

"Arctic Ocean receives 10% of fresh water inflow to the Global Ocean, although its volume is only 1% of the world ocean, likely resulting in an already greater load of CDOM in the Arctic than in other oceans (Stedmon et al., 2011). Majority Large Arctic rivers play an increasingly recognized role in regional carbon cycling by transporting a proportion of terrigenous material from land to the ocean. Significant quantities of dissolved organic matter (DOM) accompany this fresh water flux causing higher than average dissolved organic carbon (DOC) concentrations in the Arctic Ocean relative to other ocean basins (Hernes and Benner,2006; Mann et al., 2016). Combined discharge from six major Arctic rivers (Kolyma, Ob', Lena, Yenisey, Mackenzie and Yukon) constitutes up to 64% of the total fresh water discharge to Arctic Ocean. Therefore, monitoring of terrestrial input of DOM from those rivers to the Arctic Ocean is necessary for understanding a carbon cycle in this region. Remoteness and harsh environmental conditions in the region severely reduces applications of routine field monitoring methods in the Arctic. The remote sensing could be a helpful solution, in spite of its regional limitations, as it offer a broad spatial coverage and provides a synoptic picture of many biogeochemical variables. Any new regional Arctic studies providing new algorithms for retrieval biogeochemical variables are very important and have great value.

Authors have presented an empirical model linking optical signatures of dissolved organic matter and dissolved organic carbon concentration, based on large data set of in situ measured CDOM absorption coefficient and DOC concentration collected in multiple expeditions in the Lena river estuary and Laptev Sea. Derived relationship was applied to CDOM absorption coefficients values estimated from ocean color remote sensing data from different processing algorithms. Authors have compared products from 3 neural network ocean color algorithms applied to MERIS data. The assessment of CDOM absorption coefficient at  $\lambda$ =440 or 443 nm, proved that the ONNS algorithm showed best performance in the extremely CDOM rich water of Lena river estuary and adjacent coastal Laptev Sea waters. The empirical relationship between aCDOM(443) and DOC was then applied to OCRS CDOM absorption coefficient retrieval and the surface maps of DOC distribution in the Laptev Sea were produced. The modelled DOC values were compared with DOC measured in situ showing moderate accuracy ( $R^2 = 0.53$ ).

Author have undertaken a challenging task, due to overall difficulty in ocean color remote sensing in the high latitude polar areas due to persistent cloud cover and very low level of upwelling radiance, caused by low Sun zenith angle. Therefore, their calibration/validation exercise could not meet rigorous criteria set for such studies by Gregg and Casey (2004). The principle requirement of calibration/validation of ocean color remote sensing is the maximum mismatch between time of in situ observation and time of satellite scene acquisition no longer than 3 hours. This criterion is almost impossible to achieve in Arctic coastal waters, characterized by high heterogeneity of spatial distribution of optically significant constituents, in riverine plume, which distribution is forced by winds, tides and frequent bottom sediments resuspension events in the presence of drift sea ice and high cloudiness. Authors have honestly acknowledged this being very conservative in their

assessments of satellite imagery products. Personally I highly acknowledge their results, that have been achieved against all odds.

A manuscript presented me for review contains new and innovative approach to derive spatial and temporal distribution of important biogeochemical variable. I do not have any major critical comments on methodology applied by authors and presentation of their work and results. I have found some minor mistake that could be corrected during revision (listed in the detailed comments section), and I do recommend publication of manuscript by Juhls et al., in Biogeosciences after minor revision."

Thank you very much for this positive review on our manuscript.

### SPECIFIC COMMENTS:

### Abstract

"Page 1, Line 15.: "Minor technical remark concerning use of optical symbols letter "a" in  $aCDOM(\lambda)$  shall be italicized. Please apply this format to all optical symbols in the manuscript." This has been changed accordingly in the text and figures.

**"Page 1** Line 16: "Observed changes in aCDOM and its ..." Please specify wavelength of CDOM absorption coefficient at which this quantity was measured, referred."

In this study we preferably used the wavelengths 443 nm to allow comparisons with other studies (see Fig. 4) and OCRS data. We specified the wavelength in the text:

"Observed changes in  $a_{CDOM}(443)$  and its spectral slopes indicate that DOM is modified by microbial-and photo-degradation."

### Introduction

**"Page 2** Line 2, "Large volumes of fresh water and dissolved organic matter (DOM) are discharged by Arctic rivers into the Arctic Ocean ..."

Please give number estimated of fresh water and DOC discharge to Arctic Ocean based on cited literature. "

We inserted number from recent literature:

"Large volumes of fresh water (3588  $\pm$  257 km<sup>3</sup> yr<sup>-1</sup>, Syed et al., 2007) and dissolved organic matter (DOM) (25–36 Tg C yr<sup>-1</sup>, Raymond et al., 2007) are discharged by Arctic rivers into the Arctic Ocean (Cooper et al., 2005; Dittmar and Kattner, 2003; Stedmon et al., 2011)"

**"Page 2**, Lines 8-9" ...from the Lena River, which delivers around one fifth of all river water to the Arctic Ocean ..."

Based on cited literature, please give number estimated of Lena River fresh water discharge. "

We calculated the mean and the standard deviation of the Lena River discharge based on values from Bauch et al. (2013), Fedorova et al. (2013), Stedmon et al. (2011):

"The Laptev Sea is a wide shelf sea in the eastern Arctic, characterized by fresh surface waters from the Lena River, which delivers around one fifth ( $\sim$ 609.5  $\pm$  59 km<sup>3</sup> yr<sup>-1</sup>) of all river water to the Arctic Ocean (Bauch et al., 2013; Fedorova et al., 2013; Stedmon et al., 2011)."

**"Page 2** Line 13, "... the Lena River has the highest peak concentrations of DOC of all Arctic rivers ..." How much is peak DOC concentration – please give a number. "

We added peak DOC concentration from Stedmon et al., (2011):

"Moreover, the Lena River has the highest peak concentrations of DOC of up to 1600 µmol/L (Stedmon et al., 2011) of all Arctic rivers."

"Page 2 Line 31: "... focused on optically deep (Case 1) waters ..."

Wrong citation, Kutser et al., 2017, did not developed the optical classification to optical Case 1 and Case 2 waters. When referring to optical Case 1 water type, please cite original paper by Morel and Prieur, (1977), where this concept was formulated. Alternatively you can cite paper by former students of prof. Andre Morel, who has given an updated interpretation of Case 1, Case 2 water

classification, in the paper by Antoine et al., 2014 (Annu. Rev. Mar. Sci. 2014. 6:1–21). The citation to paper by Mobley et al., 2004 is correct. "

We deleted Kutser et al. (2017) and replaced it with Morel and Prieur (1977) and Antoine et al. (2014):

"However, most OCRS retrieval algorithms have focused on optically deep (Case 1) waters, which usually correspond to open ocean where all optical water constituents are coupled to chlorophyll concentration (Antoine et al., 2014; Mobley et al., 2004; Morel and Prieur, 1977)."

"Page 3 Lines 6 – 14: A paragraph on relationships between aCDOM( $\lambda$ ) and DOC. You should mention a paper by Massicotte et al., (2017) who has presented a consistent global relationships between aCDOM( $\lambda$ ) and DOC based on more than 12000 in situ measurements from variety of fresh, estuarine, coastal, marine and oceanic environments. "

We added Massicotte et al. (2017) as a global model to the manuscript:

"In order to estimate DOC concentration from  $a_{CDOM}(\lambda)$ , a number of empirical relationships between in situ DOC and  $a_{CDOM}(\lambda)$  for Arctic regions (Fichot and Benner, 2011; Gonçalves-Araujo et al., 2015; Mann et al., 2016; Matsuoka et al., 2012; Örek et al., 2013; Spencer et al., 2009; Walker et al., 2013), as well as global (Massicotte et al., 2017), are presented in recent studies."

**"Page 3** Lines 19-21: "Spectral characteristics of aCDOM( $\lambda$ ) and their correlation to the DOC specific absorption coefficient ..."

I could not find any relationship between spectral characteristics of aCDOM(λ) (spectral slope coefficient) and DOC specific absorption coefficient in the paper by Stedmon at al., (2011). I found a table that presented a SUVA(254) values of Siberian and North American Rivers, which indicated slightly lower DOC specific absorption for Yukon River in comparison to Siberian Rivers. The relationship mentioned by Authors has been published by Matsuoka et al., (2012) in the Western Artic Ocean, by Makarewicz et al., (2018) in European section of Arctic Ocean and by Norman et al., (2011) in Antarctica. Most of relationships between those variables were published for tropical/subtropical and temperate estuaries e.g. Mississippi River (Fichot and Benner, 2011, 2012) or Red River Delta, French Guyana and English Channel (Vantrepotte et al. 2015). Please rewrite this sentence specifying exactly which type of spectral characteristics you mean, and refer to paper, where correlation between defined variables could be found. "

Thank you for pointing out this imprecisely written sentence. We restructured the sentence and corrected the references as proposed. Unfortunately, the intercomparisons between studies are limited due to the different choices of  $a_{\rm CDOM}$  reference wavelength and the missing data publication of complete spectrally resolved  $a_{\rm CDOM}$  data. We indicated that in an additional sentence:

"Recent studies presented  $a_{CDOM}(\lambda)$  slopes at different wavelengths ranges and their correlation to the DOC specific absorption coefficient ( $a*_{CDOM}(440)$ ) at different wavelengths for the Eastern Arctic Ocean (EAO) (Makarewicz et al., 2018: S300-600 to  $a*_{CDOM}(350)$ ) and the Western Arctic Ocean (WAO) (Matsuoka et al., 2012: S350-500 to  $a*_{CDOM}(440)$ ). However, direct comparisons of published studies is made difficult by their use of different reference wavelengths."

## **Material and Methods**

"Page 5 Line 6: "Spectral slopes of aCDOM( $\lambda$ ) were calculated fitting Eq. (2) for the individual wavelength range."

Please, specify which wavelength range you used to calculate spectral slope coefficient S. "We added the missing information to the text:

"Spectral slopes of  $a_{CDOM}(\lambda)$  were calculated fitting Eq. (2) for the individual wavelength ranges (275 to 295 nm for S275-295 and 350 to 500 nm for S350-500)."

### Satellite data

"Page 5 Section 2.3: Please specify which satellite algorithms has been used to derive total suspended matter concentration values that have been used for analysis in Discussion. This information is missing."

We added information into this section, however, in the discussion we always indicate the algorithm which was used to derive TSM:

"All algorithms used in this study use neural networks trained with databases of radiative transfer simulations or in situ measurements or both to invert the satellite signal into a number of inherent optical water properties such as  $a_{CDOM}(\lambda)^{sat}$  and concentrations such as total suspended sediment (TSM)."

### **Results**

"Page 8 Line 7-8: "Most samples from this study are located below the a\*CDOM(440) limits of oceanic water reported by Nelson and Siegel, (2002) ..."

It would be good if global data distribution of DOC specific CDOM absorption coefficient presented in the paper by Massicotte at al., (2017) would be used here for comparison. "

We agree that a comparison of the CDOM absorption characteristics to the global distribution from Massicotte et al. (2017) is very useful to better classify our samples and put them into a bigger context. We added the data from Massicotte et al. (2017) into the background of Figure 4 and used colors to indicate the salinity of the samples.

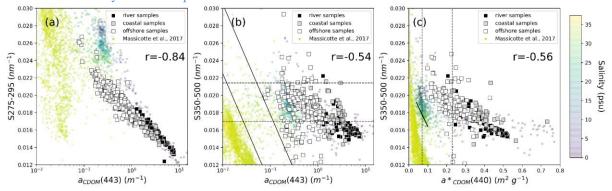


Figure 4: (a) Relationship between  $a_{CDOM}(443)$  and S275-295; (b)  $a_{CDOM}(443)$  vs. S350-500 with 95% confidence intervals of regressions of western Arctic coastal waters (dashed lines) and for western Arctic oceanic water (solid lines) reported by Matsuoka et al., (2011), (2012), (c)  $a_{CDOM}(440)$  vs. S350-500 with dashed lines representing the borders of  $a_{CDOM}(440)$  for oceanic waters report by Nelson and Siegel, (2002) and solid line shows the reported relationship between  $a_{CDOM}(440)$  and S350-500 from Matsuoka et al., (2012). Circles show global data from Massicotte et al., 2017 where colors indicate the salinity.

## We added information to the text:

"Compared to the global CDOM absorption characteristics from Massicotte et al. (2017) (Fig 4a to c, colored circles), samples from this study are within the range of freshwater influenced samples with lower salinities and clearly differentiate from high saline oceanic waters."

"Page 8 Section 3.3: I think that first paragraph of this section is an introduction to subsection 3.4. "We agree that due to the ending of the paragraph it sounded misplaced. We adapted the text so it suits better for subsection 3.3. However, we think that this paragraph, which lists the three steps, should be in the beginning of this subsection to introduce the reader to the following subsections: "Generally, retrieval of optical water properties and water constituents such as DOC from satellite

data consists of three steps: (1) atmospheric correction of the top of atmosphere radiance to the water-leaving or the in-water reflectance, which is needed as input for the OCRS algorithms, (2) the retrieval of  $a_{CDOM}(\lambda)^{sat}$  from the atmospherically-corrected reflectance received by satellite, and (3) if  $a_{CDOM}(\lambda)^{sat}$  is retrieved from OCRS, DOC can be calculated using an in situ DOC versus in situ  $a_{CDOM}(\lambda)$  relationship. The direct validation and evaluation of different atmospheric corrections (1) is beyond the scope of this study. In the following, we present a new regional DOC- $a_{CDOM}(\lambda)$  relationship (3) from our compiled in situ dataset."

## References

"Hansell Carlson and Amon,: Wrong citation. I assume that you referred to book edited by Dennis A. Hansell and Craig A. Carlson. I quickly browsed through both editions on line and could not find any chapter authored by Hansell Carlson and Amon. Please give exact bibliographic citation, which chapter and which edition you have cited. "

Thank you for pointing out this mistaken citation. We intended to cite the chapter "Chromophoric DOM in the open ocean" from Nelson and Siegel, (2002) in the end of the previous sentence.

We corrected the text and used the correct citation and reference of the chapter in the book of Hansell et al. (2002):

"Hereinafter, we refer to satellite derived  $a_{CDOM}(\lambda)$  as  $a_{CDOM}(\lambda)^{sat}$ . CDOM absorbs light in the ultraviolet and visible wavelengths (Green and Blough, 1994) and can be used to estimate DOC concentration (Nelson and Siegel, 2002). Thus, OCRS provides an alternative to discrete water sampling (Matsuoka et al., 2017)."

"Hieronymi et al 2016: this is a conference paper, listed as submitted to ESA special publication. I am not sure if this is a peer reviewed publication and shall be included in references list. Please give exact bibliographic citation of the paper you cite not the link to the web site. If it is a web journal you should use DOI citation. "

We deleted the non-peer-reviewed reference.

# Dissolved Organic Matter at the Fluvial-Marine Transition in the Laptev Sea Using in situ Data and Ocean Color Remote Sensing

Bennet Juhls<sup>1</sup>, Pier Paul Overduin<sup>2</sup>, Jens Hölemann<sup>3</sup>, Martin Hieronymi<sup>4</sup>, Atsushi Matsuoka<sup>5</sup>, Birgit Heim<sup>2</sup>, Jürgen Fischer<sup>1</sup>

Abstract. River water is the main source of dissolved organic carbon (DOC) in the Arctic Ocean. DOC plays an important

- <sup>1</sup>Institute for Space Sciences, Department of Earth Sciences, Freie Universität Berlin, Berlin, Germany <sup>2</sup>Alfred Wegener Institute Helmholtz Centre for Polar and Marine Research, Potsdam, Germany <sup>3</sup>Alfred Wegener Institute Helmholtz Centre for Polar and Marine Research, Bremerhaven, Germany <sup>4</sup>Institute of Coastal Research, Helmholtz-Zentrum Geesthacht, Geesthacht, Germany <sup>5</sup>Takuvik Joint International Laboratory, Département de Biologie, Université Laval, Canada
- 10 Correspondence to: Bennet Juhls (bjuhls@wew.fu-berlin.de)

role in the Arctic carbon cycle and its export from land to sea is expected to increase as ongoing climate change accelerates permafrost thaw. However, transport pathways and transformation of DOC in the land-to-ocean transition are mostly unknown. We collected DOC and  $\rho_{CDOM}(\lambda)$  samples from 11 expeditions to river, coastal and offshore waters and present a new DOC- $\rho_{\rm CDOM}(\lambda)$  model for the fluvial-marine transition zone in the Laptev Sea. The  $\rho_{\rm CDOM}(\lambda)$  characteristics revealed that the dissolved organic matter (DOM) in samples of this dataset are primarily of terrigenous origin. Observed changes in  $\rho_{\text{CDOM}}(443)$ and its spectral slopes indicate that DOM is modified by microbial- and photo-degradation. Ocean Color Remote Sensing (OCRS) provides the absorption coefficient of colored dissolved organic matter  $(a_{\text{CDOM}}(\lambda)^{\text{sat}})$  at  $\lambda$ =440 or 443 nm, which can be used to estimate DOC concentration at high temporal and spatial resolution over large regions. We tested the statistical performance of five OCRS algorithms and evaluated the plausibility of the spatial distribution of derived  $\rho_{\text{CDOM}}(\lambda)^{\text{sat}}$ . The ONNS algorithm showed the best performance compared to in situ \(\alpha\_{CDOM}(440)\) (r^2=0.72). Additionally, we found ONNSderived  $\rho_{\text{CDOM}}(440)$ , in contrast to other algorithms, to be partly independent of sediment concentration, making ONNS the most suitable  $\mu_{CDOM}(\lambda)^{sat}$  algorithm for the Laptev Sea region. The DOC- $\mu_{CDOM}(\lambda)$  model was applied to ONNS-derived  $\mu_{\text{CDOM}}(440)$  and retrieved DOC concentration maps showed moderate agreement to in situ data (r<sup>2</sup>=0.53). The in situ and satellite-retrieved data were offset by up to several days, which may partly explain the weak correlation for this dynamic region. Satellite-derived surface water DOC concentration maps from MERIS satellite data demonstrate rapid removal of DOC within short time periods in coastal waters of the Laptev Sea, which is likely caused by physical mixing and different types of degradation processes. Using samples from all occurring water types leads to a more robust DOC- $\mu_{\text{CDOM}}(\lambda)$  model for the retrievals of DOC in Arctic shelf and river waters.

Formatted: Font: Italic

#### 1 Introduction

Large volumes of fresh water and dissolved organic matter (DOM)(3588 ± 257 km³ yr⁻¹) (Syed et al., 2007) and DOM (25–36 Tg C yr⁻¹) (Raymond et al., 2007) are discharged by Arctic rivers into the Arctic Ocean (Cooper et al., 2005; Dittmar and Kattner, 2003; Stedmon et al., 2011). Recent studies predict an increase of DOM flux to the Arctic Ocean with continued climate warming and permafrost thawing (Camill, 2005; Freeman et al., 2001; Frey and Smith, 2005). This will lead to a cascade of effects on the physical, chemical and biological environment of Arctic shelf waters (Stedmon et al., 2011). These include an increase of radiative heat transfer into surface waters, changes in carbon sequestration, and reductions of sea-ice extent and thickness (Hill, 2008; Matsuoka et al., 2011).

The Laptev Sea is a wide shelf sea in the eastern Arctic, characterized by fresh surface waters from the Lena River, which delivers around one fifth (609.5 ± 59 km³ yr⁻¹) of all river water to the Arctic Ocean. (Bauch et al., 2013; Fedorova et al., 2013; Stedmon et al., 2011). River water is the main source of DOM and thus of dissolved organic carbon (DOC) and colored dissolved organic matter (CDOM) to the Laptev Sea shelf (Cauwet and Sidorov, 1996; Gonçalves-Araujo et al., 2015; Kattner et al., 1999; Lobbes et al., 2000; Thibodeau et al., 2014; Vantrepotte et al., 2015). Moreover, the Lena River has the highest peak concentrations of DOC of up to 1600 µmol L⁻¹ (Stedmon et al., 2011) of all Arctic rivers. The fate and transformation of DOM as it is discharged to the Arctic Ocean, however, are not well known. Physical and biological processes, such as photodegradation (Gonçalves-Araujo et al., 2015; Helms et al., 2008, 2014; Opsahl and Benner, 1997) and microbial degradation (Benner and Kaiser, 2011; Fasching et al., 2015; Fichot and Benner, 2014; Matsuoka et al., 2012, 2015), as well as mineralization (Kaiser et al., 2017) and flocculation (Asmala et al., 2014; Guo et al., 2007), are responsible for the modification and removal of DOM from river-influenced surface waters. Given the strong seasonality of Lena River runoff (Yang et al., 2002), DOC concentration varies greatly in time and space (Amon et al., 2012; Cauwet and Sidorov, 1996; Raymond et al., 2007; Stedmon et al., 2011). Once exported to the sea, rapid transport of water masses and dislocation of fronts cause rapid changes in concentrations of surface water constituents at any given location.

Therefore, DOC sampling at high temporal and spatial resolutions over long periods is necessary to understand these changes. Discrete in situ sampling of DOC during expeditions provides point measurements at the time of sampling and is complicated by the difficulty of accessing shallow water for ocean-going vessels. The resulting inadequacy of sample coverage in space and time can be overcome by using Ocean Color Remote Sensing (OCRS) data. The absorption coefficient of CDOM ( $\alpha_{CDOM}(\lambda)$ ) at a reference wavelength  $\lambda$  (usually  $\lambda$ =443 nm or  $\lambda$ =440 nm is used) is an optical property of the water and can also be derived with OCRS during ice and cloud-free periods. Hereinafter, we refer to satellite derived  $\alpha_{CDOM}(\lambda)$  as  $\alpha_{CDOM}(\lambda)$  as  $\alpha_{CDOM}(\lambda)$  and can be used to estimate DOC concentration. (Nelson and Siegel, 2002). Thus, OCRS provides an alternative to discrete water sampling (Hansell et al., 2002; Matsuoka et al., 2017) (Matsuoka et al., 2017). DOC concentration maps with high spatial and temporal resolution will improve our understanding of DOC dynamics in fluvial-marine transition zones and better quantify carbon cycling. However, most

Formatted: Font: Italic

Formatted: Font: Italic

OCRS retrieval algorithms have focused on optically deep (Case 1) waters, which usually correspond to open ocean where all optical water constituents are coupled to chlorophyll concentration (Kutser et al., 2017; Mobley et al., 2004). (Antoine et al., 2014; Mobley et al., 2004; Morel and Prieur, 1977). Generally, the Laptev Sea coastal to central-shelf waters and Lena River water can be classified as extreme-absorbing and high-scattering waters with high optical complexity (Case 2) (Heim et al., 2014; Hieronymi et al., 2016). (Heim et al., 2014). Algorithms for Case 1 water do not provide reasonable estimates of water constituents in optically complex waters (Antoine et al., 2013). Hieronymi et al. (2017) use a novel algorithm for the retrieval of OCRS products such as  $\rho_{\text{CDOM}}(440)$ . This algorithm is specifically designed for a broad range of concentrations of different water constituents including extremely high absorbing waters with  $\rho_{\text{CDOM}}(440)$  of up to 20 m<sup>-1</sup>.

In order to estimate DOC concentration from  $\rho_{\text{CDOM}}(\lambda)$ , a number of empirical relationships between in situ DOC and  $\rho_{\text{CDOM}}(\lambda)$  for Arctic regions are presented in recent studies (Fichot and Benner, 2011; Gonçalves-Araujo et al., 2015; Mann et al., 2016; Matsuoka et al., 2012; Örek et al., 2013; Spencer et al., 2009; Walker et al., 2013), as well as global (Massicotte et al., 2017), are presented in recent studies. However, the DOC- $\rho_{\text{CDOM}}(\lambda)$  relationship can vary in different water types and can change between seasons and regions (Mannino et al., 2008; Vantrepotte et al., 2015). Furthermore, existing Arctic datasets of DOC and  $\rho_{\text{CDOM}}(\lambda)$  taken in situ are almost all limited to either offshore, coastal or river waters, so that a DOC- $\rho_{\text{CDOM}}(\lambda)$  relationship has not been established for the range of water types in Arctic coastal waters. Samples from near-shore waters from Arctic shelves are under-represented in these datasets. In order to obtain synoptic DOC concentration maps that cover the fluvial-marine transition, a relationship valid for a combination of these different water types is required.

In this study, we aim to better understand the transport of organic material from land to sea in the Arctic and improve its detection at regional scale in the Laptev Sea, where the Lena River provides a major source of DOM to the Arctic Ocean. For this, we compile a dataset of DOC and  $\mu_{\text{CDOM}}(\lambda)$  samples collected during multiple expeditions to the Laptev Sea and Lena River region in order to investigate the optical characteristics and variability of  $\mu_{\text{CDOM}}(\lambda)$ . With this dataset, we develop a new DOC- $\mu_{\text{CDOM}}(\lambda)$  relationship which we apply to OCRS data in order to estimate DOC concentration from space. We test and evaluate the accuracy of different OCRS algorithms for the fluvial-marine transition zone in the Laptev Sea.

7	Formatted: Font: Italic
$\dashv$	Formatted: Font: Italic
-	Formatted: Font: Italic
-	Formatted: Font: Italic
-	Formatted: Font: Italic
-	Formatted: Font: Italic
Y	Formatted: Font: Italic
-1	Formatted: Font: Italic
,	
-	Formatted: Font: Italic
1	Formatted: Font: Italic

Formatted: Font: Italic
Formatted: Font: Italic
Formatted: Font: Italic

#### 2 Material and Methods

#### 2.1 Study area & expeditions

The in situ data presented in this study are compiled from several, mostly unpublished datasets from Russian-German expeditions to the Lena River and Laptev Sea that took place from 2010 to 2017 (Table 21). Sampling locations of this dataset include large parts of the western and central Laptev Sea shelf, coastal regions around the Lena River Delta and channels of the Lena River (Fig. 1).

All ship- and land-based sampling took place during the ice-free period between the end of June and mid-September. Only one land-based sampling in the central Lena River Delta took place between the end of May and the end of June, during Lena River peak discharge after the ice break-up. The ship expeditions, which covered offshore shelf waters (NE10, YS11, VB13 and VB14), were conducted on board RV Nikolay Evgenov (NE), RV Jacob Smirnitsky (YS) and RV Viktor Buynitskiy (VB), respectively. For the other ship expeditions, smaller boats were used for sampling in coastal waters or on the Lena River. Water sampling at the research station on Samoylov Island (LD14) was carried out from small boats or from the shore (Fig. 1). Table  $\frac{12}{2}$  shows a summary of sampling periods, water types and the sampled parameters of the individual expedition datasets.

### 5 2.2 Hydrographic characteristics and sample processing

For each sampling location included in this dataset, vertical profiles of the water column temperature and salinity were measured with a CTD (Sontek CastAway CTD for LD14, LD15, LD16, Byk17 and a Seabird 19+ for LD10, LD13, NE10, YS11, VB13, VB14, GA13). In this study we use the practical salinity unit (psu) to describe salinity. Aboard ships and boats, water samples were taken using Niskin bottles or an UWITEC water sampler at defined depths. Since this study focuses on improving satellite retrievals, only surface water samples (discrete samples from 2 and 5 m water depth) were included in the compiled dataset. Based on visual examination of the water column characteristics we also included samples from 10 m depth wherever a thick homogeneous upper mixed layer was present. During the expedition LD14, water samples were taken from the shore of Samoylov Island at around 0.5 m depth using 5-liter glass bottles

Water samples for DOC analysis were filtered through 0.7 µm GF/F filter and acidified with 25 µL HCl suprapur (10 M) after sampling. Samples were stored cool and dark for transport. DOC concentrations were measured using high temperature catalytic oxidation (TOC-VCPH, Shimadzu). Three measurements of each sample were averaged and after each 10 samples, a blank and a standard (*Battle-02*, *Mauri-09* or *Super-05* certified reference material from National Laboratory for Environmental Testing, Canada) were measured for quality control.

Samples for  $\rho_{CDOM}(\lambda)$  analysis were filtered through 0.22  $\mu$ m Millipore GSWP filters (GA13, LD16, Byk17) or 0.7  $\mu$ m Whatman GF/F (LD10, YS11, VB13, VB14, LD14, LD15) after sampling. 100 ml filtrate was stored cool and dark in amber glass bottles until further analysis.  $\rho_{CDOM}(\lambda)$  was measured with a spectrophotometer (SPECORD 200, Analytik Jena)

Formatted: Font: Italic

by measuring the absorbance  $(A_{\lambda})$  at 1 nm intervals between 200 and 750 nm. Absorption was calculated from the resulting absorbance measurements via

$$\frac{\mathbf{a}_{\mathsf{CDOM}}a_{\mathsf{CDOM}}(\lambda) = \frac{2.303*A_{\lambda}}{L},$$

(1)

where L is the path length (length of cuvette), to calculate the  $\rho_{\text{CDOM}}(\lambda)$ . Fresh Milli-Q water was used as reference. The quartz cuvette length varied depending on the expected absorption in the sampled water (1 or 5 cm for river or coastal waters, 5 or 10 cm for offshore shelf waters). Resulting  $\rho_{\text{CDOM}}(\lambda)$  spectra were corrected for baseline offsets by subtracting the mean absorption between 680 and 700 nm, assuming zero absorption at >-680 nm. We focussed on  $\rho_{\text{CDOM}}$  at 443 nm since most OCRS algorithms use this wavelength to retrieve  $\rho_{\text{CDOM}}(\lambda)$ . This wavelength corresponds to one spectral band of most multispectral satellite sensors. Spectral slopes of  $\rho_{\text{CDOM}}(\lambda)$  were calculated by non-linearly fitting the following equation: (Jerlov, 1969; Bricaud et al., 1981):

$$a_{\text{CDOM}}a_{\text{CDOM}}(\lambda) = \frac{1}{a_{\text{CDOM}}}a_{\text{CDOM}}(\lambda_0) * e^{-S(\lambda - \lambda_0)}$$
(2)

where  $\rho_{\text{CDOM}}(\lambda_0)$  is the absorption coefficient at reference wavelength  $\lambda_0$  and S is the spectral slope of  $\rho_{\text{CDOM}}(\lambda)$  for the chosen wavelength range. Spectral slopes of  $\rho_{\text{CDOM}}(\lambda)$  were calculated fitting Eq. (2) for the individual wavelength range-ranges (275 to 295 nm for S275-295 and 350 to 500 nm for S350-500). The DOC specific absorption coefficient at  $\lambda$ =440 nm was calculated with  $\rho^*_{\text{CDOM}}(440)=\rho_{\text{CDOM}}(440)/\text{DOC}$ .

#### 2.3 Satellite data

In order to monitor spatiotemporal variability of DOC in surface waters and test the applicability of the established DOC- $\rho_{CDOM}(\lambda)$  model from this study, we used OCRS. We applied the DOC- $\rho_{CDOM}(\lambda)$  model to calculate DOC concentration from satellite-retrieved  $\rho_{CDOM}(\lambda)$ . For this study, we chose the Medium Resolution Imaging Spectrometer (MERIS) because of its high spectral resolution and spectroradiometric quality—(Delwart et al., 2007). Many OCRS algorithms were developed specifically for this sensor and are designed for coastal waters. MERIS L1 satellite scenes at reduced resolutions (1 km spatial resolution) were obtained from the MERIS Catalogue and Inventory (MERCI). Scenes with reduced resolution were chosen because of their larger extent and thus better coverage of the in situ data stations. Furthermore, Hu et al. (2012) reported a better signal to noise ratio compared to MERIS full resolution data and recommended the use of MERIS reduced resolution data. We checked all expedition periods for cloud-free MERIS satellites scenes but only two expeditions from 2010 (LD10 and NE10 ship expeditions) could be used to evaluate the performance of the remote sensing retrieval of the surface water DOC concentration. During those periods, we identified a few scenes with substantial cloud-free data coverage that were acquired during the 2010 expedition periods. Table  $\frac{12}{2}$  lists MERIS scenes used in this study. In order to visualize satellite-derived results, we generated mosaic images containing the average of the overlap from multiple satellite scenes to extend the data coverage between cloud gaps. To compare in situ with satellite data, we used the median of 3 by 3 extracted pixel values

roi illatteu.	it. Italic
Formatted: For	nt: Italic
Formatted: For	nt: Italic
Formatted: For	nt: Italic
Formatted: For	nt: Italic
Formatted: For	nt: Italic

from each single <u>processed OCRS</u> image. To discuss processes that cause differences between satellite images we extracted reanalysis surface wind data (4 times daily) from the National Centers for Environmental Prediction.

Hieronymi et al. (2017) developed the OLCI (Sentinel-3 Ocean and Land Colour Instrument) Neural Network Swarm (ONNS) in-water algorithm for the retrieval of OCRS products, among them  $\rho_{\text{CDOM}}(440)$ . This algorithm is designed for broad concentration ranges of different water constituents, including extremely high absorbing waters. The algorithm differentiates 13 optical water types (OWT) and uses specific neural networks (NN) for each OWT. Every NN is trained for narrow concentration ranges. The values of  $\rho_{\text{CDOM}}(440)$  used for the training of the NN's are up 20 m<sup>-1</sup>. The final product is a weighted sum of all NNs depending on OWT membership. The standard atmospheric correction of ONNS, namely the C2RCC (Brockmann et al., 2016), is applied. ONNS makes use of 11 out of the 21 OLCI bands, including the 400 nm band, which is the only one not delivered by MERIS. In order to retrieve OCRS products with ONNS from MERIS imagery, a band adaptation NN-algorithm is utilized to extrapolate remote sensing reflectance at 400 nm, which is usually provided with an uncertainty <5 % for these waters (Hieronymi, 2019). Note that the ONNS-algorithm uses the  $\rho_{\text{CDOM}}(\lambda)$  wavelength 440 nm whereas all other algorithms use 443 nm.

Additionally, we tested the following open source OCRS algorithms: (1) FUB/WeW MERIS Case-2 Water properties processor (FUB/WeW) (Schroeder and Schaale, 2005) developed for  $\rho_{CDOM}(443)$  up to 1 m<sup>-1</sup>), MERIS case 2 water algorithm (C2R) (Doerffer and Schiller, 2007) ( $\rho_{CDOM}(443)$  up to 1 m<sup>-1</sup>) which is used for the MERIS 3rd Reprocessing of ESA's distributed products, and the Case 2 Regional CoastColour (C2RCC) (Brockmann et al., 2016) with C2RCC ( $\rho_{CDOM}(443)$  up to 1 m<sup>-1</sup>) and C2X ( $\rho_{CDOM}(443)$  up to 60 m<sup>-1</sup>). All algorithms used in this study use neural networks trained with databases of radiative transfer simulations or in situ measurements or both to invert the satellite signal into inherent optical water properties—such as  $\alpha_{CDOM}(\lambda)$  and concentrations such as total suspended sediment (TSM). In this study the atmospheric correction from Case 2 Regional CoastColour processor (C2RCC) (Brockmann et al., 2016) was used to provide atmosphere corrected reflectances for the OCRS algorithms ONNS, C2R, C2RCC and C2X. For the FUB/WeW algorithm the atmospheric correction provided by the FUB/WeW processor (Schroeder and Schaale, 2005) was used.

#### 2.3.1 Functions for satellite retrieval evaluation

25 In order to evaluate the retrieval of a μ<sub>CDOM</sub>(λ)<sup>sat</sup> from the tested OCRS algorithms, we used a number of evaluation parameters suggested by Bailey and Werdell (2006) and Matsuoka et al. (2017). Among them, we use the median of satellite to in situ ratio (Rt), the semi-interquartile range (SIQR), the median absolute percent error (MPE), and root mean square error (RMSE). The evaluation parameters are defined as follows:

$$Rt = median(\frac{x_{sat}}{x_{in \, situ}}),\tag{3}$$

30 
$$SIQR = \frac{Q_3 - Q_1}{2}$$
, (4)

$$MPE = median(100 * \left| \frac{x_{sat} - x_{in \, situ}}{x_{in \, situ}} \right|), \tag{5}$$

Formatted: Font: Italic

Formatted: Font: Italic

Formatted: Font: Italic

Formatted: Indent: First line: 0 cm

Formatted: Font: Italic

Formatted: Font: Italic

Formatted: Font: Italic

Formatted: Font: Italic

$$RMSE = \sqrt{\frac{\sum_{n=1}^{N} |X_{sat} - X_{in \ situ}|^2}{N}},\tag{6}$$

where  $X_{sat}$  and  $X_{in situ}$  are the satellite-derived and in situ measured  $\rho_{CDOM}(443)$ , respectively. Q1 represents the 25<sup>th</sup> ratio percentile and Q3 represent the 75<sup>th</sup> ratio percentile.

### 3 Results

#### 5 3.1 Spatial and temporal variability of DOC and CDOM

To examine variability of DOC and CDOM optical properties along the land-ocean continuum of the Lena-Laptev system, we generated a large dataset that covers spring freshet through late summer from 2010 to 2017 (Table 21). Compared to previously published datasets (Gonçalves-Araujo et al., 2015; Mann et al., 2016; Matsuoka et al., 2012; Walker et al., 2013), this dataset compiles not only samples of one water type but covers river, coastal and offshore waters throughout the most variable portion of the open water season.

To better understand characteristics of DOC and  $\rho_{CDOM}(\lambda)$  in freshwater-marine waters, the compiled dataset was first classified into three water types according to salinity: (1) fresh river water with salinities from 0-0.2, (2) mesohaline coastal water with salinities from 0.2-16 and (3) offshore waters with salinities >16.

Overall, DOC concentrations tended to decrease from river to offshore. The same trend was also observed in  $\mu_{\text{CDOM}}(443)$ . In river water, DOC concentrations and  $\mu_{\text{CDOM}}(443)$  ranged from 370 to 1315 µmol L<sup>-1</sup> (median=779 µmol L<sup>-1</sup>) and 1.17 to 7.91 m<sup>-1</sup>  $\mu_{\text{CDOM}}(443)$  (median=3.61 m<sup>-1</sup>), respectively (Fig. 2a and b). DOC concentrations and  $\mu_{\text{CDOM}}(443)$  in coastal waters ranged from 205 to 923 µmol L<sup>-1</sup> (median=590 µmol L<sup>-1</sup>) and 0.71 to 3.79 m<sup>-1</sup> (median=2.05 m<sup>-1</sup>), respectively. Values in offshore water were the least variable of all three water types with DOC concentrations from 91 to 606 µmol L<sup>-1</sup> (median=2.34 µmol L<sup>-1</sup>) and  $\mu_{\text{CDOM}}(443)$  from to 0.077 to 1.86 m<sup>-1</sup> (median=0.5 m<sup>-1</sup>). Generally, observed DOC and  $\mu_{\text{CDOM}}(443)$  values were similar to reported findings from the Lena River and Laptev Sea regions (Amon et al., 2012; Cauwet and Sidorov, 1996; Gonçalves-Araujo et al., 2015; Heim et al., 2014; Raymond et al., 2007; Stedmon et al., 2011).

The spectral UV slope (S275-295) (Fig. 2c) showed similar maximum and median values for river (max.=0.0184 nm<sup>-1</sup>, median=0.0155 nm<sup>-1</sup>) and coastal waters (max.=0.0192 nm<sup>-1</sup>, median=0.0161 nm<sup>-1</sup>). We observed the lowest S275-295 in the Lena River water during the spring freshet at the beginning of June (LD14, Table 21). Offshore water has significantly higher S275-295 values ranging from 0.0158 to 0.0267 nm<sup>-1</sup> (median=0.195 nm<sup>-1</sup>). For river and coastal water, S350-500 showed a similar variability as S275-295. The range of offshore water S350-500 however, showed substantially higher variation and covered a broad range (Fig. 2d).

In contrast to trends in DOC concentrations and  $\rho_{\text{CDOM}}(443)$ ,  $\rho_{\text{CDOM}}(\lambda)$  spectral slopes in two distinct spectral domain (S275-295 and S350-500) tended to increase from river to offshore: (Fig. 2). While the spectral slopes between river (max.=0.0184 nm<sup>-1</sup>, median=0.0155 nm<sup>-1</sup>) and coastal waters (max.=0.0184 nm<sup>-1</sup>, median=0.0158 nm<sup>-1</sup>) were not substantially different, those between the river and offshore were significantly different (p-value= $\leq 10^8$ ).

Formatted: Font: Italic

Formatted: Font: Italic

Formatted: Font: Italic
Formatted: Font: Italic

Formatted: Font: Italic

Formatted: Font: Italic

Formatted: Font: Italic

Field Code Changed

Formatted: Font: Italic

### 3.2 CDOM absorption characteristics

20

We compared salinity and  $a_{\text{CDOM}}(443)$  for the compiled dataset. As in other river-influenced waters, there was a strong linear relationship between  $a_{\text{CDOM}}(443)$  and salinity ( $r^2$ =0.87, n=283) (Fig. 3), suggesting that physical mixing prevails and plays a role in near-conservative behavior of  $a_{\text{CDOM}}(\lambda)$ . For this analysis, only coastal and offshore waters were included since river water was constant in salinity but varied seasonally in  $a_{\text{CDOM}}(443)$  (LD14, Table 1). In coastal and offshore waters,  $a_{\text{CDOM}}(443)$  decreased gradually with increasing salinity. The observed mixing line is similar to the reported mixing-line for Laptev Sea shelf waters from Heim et al. (2014), which was developed using parts of this compiled dataset (LD10 & YS11). The reported relationship from Matsuoka et al. (2012), however, shows generally lower  $a_{\text{CDOM}}(443)$  values in waters of the WAO along the salinity gradient. S350-500 was very variable along the mixing-line. However, low  $a_{\text{CDOM}}(443)$  along the mixing line had high S350-500 and higher  $a_{\text{CDOM}}(443)$  had low S350-500.

Bulk information, combined use of magnitudes and spectral slopes of CDOM absorption are useful for understanding sources and/or processes involved in the modification of dissolved organic matter (e.g. Fichot and Benner (2012) and Helms et al. (2008). The strongest correlation was observed between  $\rho_{CDOM}(443)$  and the UV slope S275-295 (Fig. 4a, Pearson correlation coefficient (r) =-0.84). Similar strong correlations were reported by Fichot and Benner (2011) between  $\rho_{CDOM}(350)$  and S275-295 for coastal waters of the Beaufort Sea in the WAO. Here, we used  $\rho_{CDOM}(443)$  to make the findings useful for the OCRS community, which usually retrieves  $\rho_{CDOM}$  at 443 nm. The spectral slope S350-500 showed moderate correlation with  $\rho_{CDOM}(443)$  (Fig. 4b, r=-0.54). Furthermore, a high number of S350-500 values were located outside the range of observed S350-500 values for coastal waters of the western Arctic (dashed lines, Fig. 4b).

We observed a moderate correlation between  $\mu^*_{\text{CDOM}}(440)$  and S350-500 (Fig. 4c, r=-0.56). Most samples from this study are located below the  $a^*_{\text{CDOM}}(440)$  limits of oceanic water reported by Nelson and Siegel, (2002) indicating that water samples from this study are primarily river influenced with higher aromaticity. The reported relationship between  $a^*_{\text{CDOM}}(440)$  and S350-500 from (Matsuoka et al., 2012)Most samples from this study are located above the  $a^*_{\text{CDOM}}(440)$  limits of oceanic water reported by Nelson and Siegel (2002), dashed lines in Figure 4c, indicating that water samples from this study are primarily river influenced with higher aromaticity (Granskog et al., 2012; Helms et al., 2008; Weishaar et al., 2003). The reported relationship between  $a^*_{\text{CDOM}}(440)$  and S350-500 from Matsuoka et al. (2012), solid line in Figure 4c, deviates strongly in slope of the regression and range of  $\mu^*_{\text{CDOM}}(440)$  values from this data from the fluvial-marine transition zone of the Laptev Sea.

Compared to the global CDOM absorption characteristics from Massicotte et al. (2017) (Fig 4a to c, colored circles), samples from this study are within the range of freshwater influenced samples with lower salinities and clearly differentiate from high saline oceanic waters.

Formatted: Font: Italic	
Formatted: Font: Italic	
Formatted: Font: Italic	
Formatted: Font: Italic	
Formatted: Font: Italic	

Formatted: Font: Italic

### 3.3 DOC - CDOM relationship

10

25

30

Generally, retrieval of optical water properties and water constituents such as DOC from satellite data consists of three steps: (1) atmospheric correction of the top of atmosphere radiance to the water-leaving or the in-water reflectance, which is needed as input for the OCRS algorithms, (2) the retrieval of  $\mu_{\text{CDOM}}(\lambda)^{\text{sat}}$  from the atmospherically-corrected reflectance received by satellite, and (3) if  $\mu_{\text{CDOM}}(\lambda)^{\text{sat}}$  is retrieved from OCRS, DOC can be calculated using an in situ DOC versus in situ  $\mu_{\text{CDOM}}(\lambda)$  relationship. In the following, we present regional evaluations of a number of OCRS algorithms suitable for coastal water and an improvement of (3) with a new DOC  $\mu_{\text{CDOM}}(\lambda)$  relationship from our compiled in situ dataset. The direct validation and evaluation of different atmospheric corrections (1) is beyond the scope of this study. In the following, we present a new regional DOC- $\mu_{\text{CDOM}}(\lambda)$  relationship (3) from our compiled in situ dataset.

We observed a strong relationship between  $\rho_{\text{CDOM}}(443)$  and DOC concentration for all water samples including river to marine waters (Fig. 5). One order of magnitude variation in DOC corresponded to more than 2 orders of magnitude of variation in  $\rho_{\text{CDOM}}(443)$  for this sample set, and corresponded to the range from moderately absorbing waters  $(0.1-1.0 \text{ m}^{-1})$  to highly absorbing waters (>1.0 m<sup>-1</sup>). After testing different regression models, the best fit was derived with a power function (Eq. (7), red line in Fig. 5):

$$DOC(\mu mol * L^{-1}) = 10^{2.525} * a_{CDOM}(443)^{0.659}$$

The agreement between model and data ( $r^2$ =0.96, n=227) allowed estimation of DOC by  $\rho_{CDOM}(443)$  within a 50 % error range. The highest deviations from the fitted line corresponded to the transition zone between offshore shelf waters and coastal waters  $(\rho_{CDOM}(443)=0.5-1.5 \text{ m}^{-1})$  and to the very low end of the  $\rho_{CDOM}(443)$  range (<0.5 m<sup>-1</sup>). It is noted that the fitting model of this dataset using only offshore or river water samples would result in a lower slope (exponent=0.617 for coastal and offshore water, 0.606 for offshore water only) in the resulting DOC- $\rho_{CDOM}(443)$  model. Including coastal and river samples substantially increased the slope of the fit, which results in higher DOC estimates for high  $\rho_{CDOM}(443)$ . The reported relationship from Mann et al. (2016) is similar for high- $\rho_{CDOM}(443)$  river water but deviates for low- $\rho_{CDOM}(443)$  river water and coastal and offshore water. The model presented by Matsuoka et al. (2017) (blue line in Fig. 5) has a lower slope and results in highest differences for DOC estimation at high  $\rho_{CDOM}(443)$ .

Model coefficients for other selected  $\rho_{\text{CDOM}}(\lambda)$  wavelengths are presented in Table A1 (Appendix A). Furthermore, the relationship between S275-295 and DOC had a slightly weaker correlation with DOC ( $r^2$ =0.92) than  $\rho_{\text{CDOM}}(443)$ .

### 3.4 Satellite retrieved CDOM

To estimate the surface water DOC concentration with the presented DOC- $q_{\text{CDOM}}(\lambda)$  model (Eq. (7), Fig. 5) and generate DOC concentration maps for large scales, we need a robust and accurate retrieval of  $\rho_{\text{CDOM}}(\lambda)^{\text{sat}}$ .

We examined the performance of five OCRS algorithm in terms of  $\rho_{CDOM}(443)^{sat}$  retrieval using Eq. (3) to (6). For this purpose,  $\rho_{CDOM}(443)^{sat}$  retrievals were compared to in situ data from within 10 days of the satellite retrievals. Our comparisons showed highly varying results (Fig. 6, Fig. B1 (Appendix B), Table 3) and strong under- or overestimation of

Formatted: Font: Italic
Formatted: Font: Italic
Formatted: Font: Italic
Formatted: Font: Italic
Formatted: Font: Italic

 $\rho_{\text{CDOM}}(\lambda)^{\text{sat}}$ . Particularly in turbulent coastal waters, comparison of  $\rho_{\text{CDOM}}(443)^{\text{sat}}$  with in situ  $\rho_{\text{CDOM}}(443)$  is challenging, given the fact that the magnitude of CDOM absorption can vary greatly over a short time for the location of a given pixel. ONNS-derived  $\rho_{\text{CDOM}}(\lambda)^{\text{sat}}$  performed best ( $r^2$ =0.716, Rt= 0.679, SIQR=0.217, %MPE=58.39, RMSE=0.436). The C2X algorithms algorithm performed similarly with a lower  $r^2$  (0.65) and substantially higher %MPE (100.0) and RMSE (0.919). In addition to the comparison with in situ data, we evaluated the plausibility of the resulting spatial distributions and observed extremely high C2X-derived  $\rho_{\text{CDOM}}(443)^{\text{sat}}$  values in the Lena River mouth (up to 10 m<sup>-1</sup>). Such values of  $\rho_{\text{CDOM}}(443)$  were not confirmed by any reported in situ data. ONNS-derived  $\rho_{\text{CDOM}}(443)^{\text{sat}}$  showed values which are in the range of in situ observed  $\rho_{\text{CDOM}}(443)$ . Other algorithms show clear underestimations of  $\rho_{\text{CDOM}}(443)^{\text{sat}}$  compared to in situ data (Fig. 11, A2 B1). Thus, ONNS was the only algorithm that produced  $\rho_{\text{CDOM}}(\lambda)$  values in a similar range to in situ measured  $\rho_{\text{CDOM}}(440)$ .

### 0 3.5 Surface water DOC concentrations in coastal waters of the Laptev Sea

Using the presented DOC- $\rho_{CDOM}(\lambda)$  model, we generated satellite-derived images of surface water DOC concentrations for the Lena-Laptev Sea region. All scenes were processed with the ONNS algorithm and  $\rho_{CDOM}(440)$  was averaged for each mosaic. DOC concentrations for two mosaics (Fig. 7b & 7d) were calculated by using the adapted model from Eq. (7) with coefficients for  $\rho_{CDOM}(440)$  instead of  $\rho_{CDOM}(443)$ . The mean time difference between the two mosaics is 31 days. The DOC mosaic from early August 2010 (Fig. 7b) shows high DOC concentrations over large areas in the eastern Laptev Sea. Concentrations (>600  $\mu$ mol L<sup>-1</sup>) were highest in Buor Khaya Bay east of the Lena River Delta where the Lena River exports most of its water. The plume of the Lena River with high DOC concentrations (>500  $\mu$ mol L<sup>-1</sup>) had propagated northeastward in this scene. The DOC mosaic from September 2010 (Fig. 7d) shows generally lower DOC concentrations compared to the earlier scene. Highest concentrations were found in the coastal areas in Buor Khaya Bay (east of the Lena River Delta) and around the Olenek River Delta (west of the Lena River Delta) to the west of the Lena Delta. While ONNS performs well in river-influenced waters, we note that DOC concentrations at the northern edge can be influenced by cloud masking (patches of high DOC concentrations shown in northeast corner of Fig. 7d).

Both quasi-true color satellite images (Fig. 7a & 7c) show sediment-rich, strongly backscattering waters around the Lena River Delta resulting from fluvial transport. In the satellite image from 07.09.7 September 2010 (Fig. 7c) there is also a large strongly backscattering area in the eastern Laptev Sea, where resuspension events in shallow water (5-10 m, Fig. 1) occurred between both acquisition periods (Fig. 1). These resuspension events are not visible in the calculated DOC concentration maps at right (Fig. 7d).

### 3.5.1 In situ DOC vs. remotely-sensed DOC

To evaluate the satellite-retrieved DOC concentrations, we compared in situ and ONNS-retrieved DOC concentrations (Fig. 8) using the presented DOC- $p_{CDOM}(\lambda)$  model (Fig. 8Eq. 7) and investigated the plausibility of the DOC value ranges and the derived spatial patterns (Fig. 7b &\_c). This evaluation revealed a moderate performance ( $r^2$ =0.53, slope=0.61) (Fig. 8) despite several days difference in sampling times between satellite and in situ sampling. The use of MERIS full resolution data revealed

Torrida Tame
Formatted: Font: Italic
Formatted: Font: Italic
Formatted: Font: Italic

Formatted: Font: Italic

Formatted: Font: Italic
Formatted: Font: Italic

a slightly better performance ( $r^2$ =0.68, slope=0.77). However, we preferred the use of reduced resolution data due to the reported better quality (Hu et al., 2012). This comparison constitutes an evaluation and not a direct validation of the method. The latter is hampered by the lack of matching data and the time offsets between satellite acquisition and in situ sampling dates. The DOC- $\rho$ CDOM( $\lambda$ ) model presented in this study improved satellite-derived estimates of DOC concentration compared to estimates using the DOC- $\rho$ CDOM( $\lambda$ ) relationship reported by Matsuoka et al. (2017) ( $r^2$ =0.46, Fig. 8).

To spare in situ data for this performance test, data from LD10 was not used to develop the  $DOC_{QCDOM}(\lambda)$  model (Eq. (7)). The DOC concentrations for NE10 were calculated from in situ QCDOM(443) measurements using Eq. (7), since no in situ DOC measurements were taken on NE10. These in situ DOC concentrations are therefore not independent, but were derived from the DOC-QCDOM(443) relationship for the entire dataset. However, samples from NE10 were not used for the development of the DOC- $QCDOM(\lambda)$  relationship since in situ DOC was missing. We use the data to test the DOC retrieval for a wide range of concentrations. Further validation of the DOC retrieval will require additional in situ datasets collected simultaneously with cloud-free, open-water remote sensing acquisitions by using the MERIS successor OLCI.

### 4 Discussion

### 4.1 Sources and modification of DOM in the fluvial-marine transition

Our results showed that ρ<sub>CDOM</sub>(443) decreases as a function of salinity<sub>τ</sub> (Fig. 3), indicating that river water is the main source of CDOM on the Laptev Sea shelf waters and in coastal waters and thus that most CDOM is of terrigenous origin (Fig. 3). Despite the tight relationship, some data points deviated from the mixing line in the salinity range from 2 to 24. Deviations from the mixing line can result from combined physical, chemical, and biological processes that modify CDOM optical properties (Asmala et al., 2014; Matsuoka et al., 2015, 2017). Helms et al., (2008) and Matsuoka et al., (2012)Helms et al. (2008) and Matsuoka et al., (2012)Helms et al. (2008) and Matsuoka et al. (2012) suggested that higher ρ<sub>CDOM</sub>(443) and lower S350-500 can be used as a proxy indicating that microbial degradation is more important than photodegradation. Indeed, we observed higher ρ<sub>CDOM</sub>(443) associated with lower S350-500 within a similar salinity range (Fig. 3), pointing towards stronger microbial degradation than photodegradation.

Flocculation can also modify CDOM optical properties by removing larger molecules once the river water encounters saline water. However, given the fact that this process occurs at low salinities (0 to 3) (Asmala et al., 2014), flocculation alone cannot explain the deviation of  $a_{\text{CDOM}}(443)$  values apart from the mixing line.

S275-295 was strongly correlated with  $\rho_{\text{CDOM}}(443)$  (Fig. 4a), which is mainly associated with the high content lignin chromophores in our samples (Fichot et al., 2013) and is partly explained by the long exposure of DOM to solar radiation and the resulting photodegradation (Hansen et al., 2016; Helms et al., 2008). Lena River water shows high lignin content and higher proportion of syringyl and vanyl phenols relative to p-hydrox phenols (Amon et al., 2012). Benner and Kaiser, (2011) showed that this could make the DOM more subject to photodegradation, which might supports why such a high correlation was observed.

formatted: Font: Italic
ormatted: Font: Italic
ormatted: Font: Italic
ormatted: Font: Italic
ormatted: Font: Italic
ormatted: Font: Italic
ormatted: Font: Italic
formatted: Font: Italic
formatted: Font: Italic
ormatted: Font: Italic

**Field Code Changed** 

Compared to the strong relationship between S275-295 and  $\rho_{CDOM}(443)$ , a moderate correlation was observed for S350-500 versus  $\rho_{CDOM}(443)$  relationship (Fig. 4b), suggesting different degradation mechanisms were involved during the transition from river to coastal and offshore waters. Here we use S350-500, which is often used in the OCRS community; (Babin et al., 2003; Matsuoka et al., 2011, 2012), instead of S350-400, which is the wavelength range suggested by Helms et al. (2008). Note that the correlation between S350-500 and S350-400 is very high (r=0.98) and thus both slopes can be used. The mean river endmember value of S350-500 at salinity zero was 0.0163 nm<sup>-1</sup>. This value tends to be lower in the EOA (including Lena river mouth) than in the WAO (Matsuoka et al., 2017; Stedmon et al., 2011). The higher  $\rho_{CDOM}(443)$  associated with the lower spectral slope observed in our river and coastal waters suggested more aromaticity in waters obtained from Lena-Laptev region (Stedmon et al., 2011). This was further demonstrated by our higher  $\rho_{CDOM}^*(443)$  (Fig. 4c).

The S350-500 versus  $\rho_{CDOM}(443)$  relationship showed a moderate but significant negative correlation and most samples were within a terrestrial range (dashed lines, Fig. 4b). The fact that no samples were within the reported ranges of photodegradation for oceanic waters (solid lines, Fig. 4b) suggest that CDOM in coastal waters of the Laptev Sea would have been highly influenced by terrestrial inputs but with least photodegradation effect compared to that in oceanic waters (Matsuoka et al., 2015, 2017). It is likely that high turbidity and thus less transparent water of coastal regions in the Laptev Sea protects DOM from photodegradation. Data points outside of the ranges might indicate either microbial degradation and/or sea ice melt (Matsuoka et al., 2017). Given the only minor influence of ice melt waters during most of our field campaigns, microbial degradation is more likely for some of our samples, which is consistent with our explanation for deviated samples shown in Fig. 3.

The difference in optical properties of  $\rho_{\text{CDOM}}(\lambda)$  observed between EAO and WAO is possibly caused by geological difference rather than climatic influences (Gordeev et al., 1996). This is partly supported by the chemical characterization of lignin phenols (Amon et al., 2012). Our results showed specificity of optical properties in the Lena and Laptev Sea and underline the necessity of discussing spectral optical properties when  $\rho_{\text{CDOM}}(443)$  and DOC concentration are estimated in this region.

### 4.2 Linking CDOM absorption to dissolved organic carbon concentration

10

Previous reported DOC- $\mu_{\text{CDOM}}(\lambda)$  models such as Walker et al. (2013), Örek et al. (2013) and Mann et al. (2016) for Arctic rivers, Matsuoka et al. (2012) for WAO and Gonçalves-Araujo et al. (2015) for coastal waters are restricted in their use to the water type of samples. Our presented DOC- $\mu_{\text{CDOM}}(\lambda)$  relationship improves reported models from Mann et al., (2016) and Matsuoka et al. (2017) for the estimation of DOC from  $\mu_{\text{CDOM}}(443)$  in DOC-rich waters in transition zones of river and seawater of the Lena-Laptev region. Matsuoka et al. (2017) provided satellite-retrieved DOC concentration maps for coastal waters of the Lena River Delta region, retrieved with a DOC- $\mu_{\text{CDOM}}(443)$  relationship developed using a pan-Arctic in situ dataset. However, the retrieved DOC concentrations were likely underestimated compared to in situ measurements in the coastal regions of the Laptev Sea presented in this study. In coastal or  $\mu_{\text{CDOM}}(443)$ -rich, river-influenced water, the difference between the two relationships is expected to be highest. Applying the Matsuoka et al. (2017) relationship to  $\mu_{\text{CDOM}}(443)$ -rich waters

Formatted: Font: Italic

Formatted: English (United States)

Field Code Changed

Formatted: Font: Italic

Formatted: Font: Italic

Formatted: Font: Italic

Formatted: Font: Italic, English (United States)
Formatted: English (United States)

outside its validity ranges (>3.3 m<sup>-1</sup>) would result in underestimation of DOC compared to the relationship presented in this study. Taking mean Lena River  $\rho_{CDOM}(443)$  of 4.1 m<sup>-1</sup>, which is similar to the highest  $\rho_{CDOM}(443)$  values in coastal waters, the difference in modelled DOC concentration between both relationships is 186.8 µmol L<sup>-1</sup>. The main reason for this underestimation is likely the lack of near-coastal and river water samples with high DOC for the development of their relationship. This hypothesis was confirmed by testing the relationship of our dataset by removing coastal and river water. This decreased the slope of the fitting model and lead to an underestimation of DOC in coastal and river waters (without coastal and river water: slope=0.617). The slope of the reported fitting model from Matsuoka et al. (2017) is lower (0.448), compared to the fitting model from this study (all samples: slope=0.664). This difference highlights the importance of using a broad concentration range to develop such relationships.

The broad concentration range of the relationship presented here permits the generation of remotely sensed surface DOC concentration maps of the Laptev Sea across the fluvial-marine transition zone using  $\rho_{\text{CDOM}}(443)$ . The applicability of this relationship for other Arctic fluvial-marine transition regions (e.g. Yenisei, Ob, Kolyma, Mackenzie) is untested and the relationship may need to be extended with regionally specific data.

Previous studies using  $\rho_{\text{CDOM}}(443)$  often focused on different wavelengths for  $\rho_{\text{CDOM}}(\lambda)$ . The shape of the DOC- $\rho_{\text{CDOM}}(\lambda)$  relationship is strongly dependent on the chosen  $\rho_{\text{CDOM}}(\lambda)$  wavelength: whereas DOC- $\rho_{\text{CDOM}}(350)$  shows a linear relationship,  $\rho_{\text{CDOM}}(443)$  can be better described with a power function (see Eq. (7)). Table 4 (A1) provides coefficients for selected  $\rho_{\text{CDOM}}(\lambda)$  wavelengths. We encourage the data publication of all available wavelengths for  $\rho_{\text{CDOM}}(\lambda)$  measurements in future studies to enable direct comparisons between studies and regions.

### 4.2.1 ONNS-derived DOC

10

Using satellite-retrieved surface water DOC concentration maps (Fig. 7b & 7d), we demonstrated rapid changes in DOC concentrations in the Laptev over 1 month in late summer. The rapid DOC decrease can result from a combination of vertical mixing, dilution, and microbial- and photodegradation of the organic material in the surface water (Fichot et al., 2013; Holmes et al., 2008; Mann et al., 2012). OCRS could potentially be used to monitor the rapid removal of DOM by degradation from surface waters on Arctic shelves.

Formatted: Font: Italic
Formatted: Font: Italic
Formatted: Font: Italic

Formatted: Font: Italic

Formatted: Font: Italic

### 4.3 OCRS algorithms in shallow Arctic fluvial-marine transition zones

15

25

We observed specific problems of  $\rho_{\text{CDOM}}(\lambda)^{\text{sat}}$  retrievals for optically complex shallow shelf waters using different OCRS algorithms. The retrieved  $\rho_{\text{CDOM}}(\lambda)^{\text{sat}}$  in shallow waters often shows a co-variation with high TSM, which is a result of high particle backscatter in the water such as sediments or some phytoplankton types. In our study, we observed that most OCRS algorithms show a strong coupling of  $\rho_{\text{CDOM}}(\lambda)^{\text{sat}}$  and TSM in all areas of high sediment concentration (compare Fig 7 and 1169b).

Our study area, the Laptev Sea shelf, is characterized by extremely shallow waters with frequent resuspension of sediments from the seafloor, for example during storm events. In the Lena River plume, close to the river mouth, where large amounts of TSM and organic matter are transported to the Arctic Ocean, we expect DOC and TSM to co-vary. Once exported by the Lena River, most particles quickly settle to the seafloor whereas DOM concentration gradually decreases with increasing physical mixing and ongoing degradation. In offshore resuspension areas with very high TSM concentration, DOC and TSM do not necessarily co-vary. Large amounts of terrigenous organic matter can be mineralized on short time scales (about 50 % within a year, Kaiser et al. (2017)) and strongly degraded when deposited in sediments (Bröder et al., 2016, 2019; Brüchert et al., 2018).

We observe a strong increase of TSM concentrations in the eastern Laptev Sea in September (Fig. 9b) compared to August (Fig. 9a), which is likely caused by differences in wind speed and resulting wave energy leading to resuspension. During acquisitions in August, wind speeds were very low (NCEP reanalysis mean surface wind speed of 2.06 m½s² for 75°N & 132.5°E from 01.08.1 August 2010 – 05.08.5 August 2010) whereas in September winds were stronger (NCEP reanalysis mean surface wind speed of 6.54 m½s² for 75°N & 132.5°E from 04.09.4 September 2010 – 20.09. September 2010). A high TSM concentration in the near-coastal regions around the Lena River Delta, caused by the sediment export by the Lena River, is similar in both mosaics.

The evaluation of OCRS algorithms with in situ data showed the generally good performance of the ONNS and the C2X algorithms (Table 3). However, shallow resuspension areas are not covered by in situ measurements. Thus, the performance of OCRS algorithms cannot be tested in these areas. Whereas the C2X algorithm derives high  $\mu_{\text{CDOM}}(443)$  in the resuspension areas in the eastern Laptev Sea, the ONNS algorithm derives lewlower  $\mu_{\text{CDOM}}(440)$  (Fig. 6).

Including all pixels of each scene (Fig. 6), the ONNS-derived  $\rho_{CDOM}(440)$  does not show a linear relationship with TSM concentration (Fig. 10a). However, using only pixels proximal to the Lena River Delta, we observe a correlation (r=0.68), which is caused by the eovariation of TSM and  $\rho_{CDOM}(440)$  in river plume. The C2X-derived  $\rho_{CDOM}(443)$  shows a linear relationship between  $\rho_{CDOM}(443)$  and TSM (r=0.79). The correlation regimes of the  $\rho_{CDOM}(443)$  and TSM from river mouth regions and resuspension areas are visible (Fig. 10b). Thus, we show that C2X-derived  $\rho_{CDOM}(443)$  might vary with TSM. Further confirmation of these satellite-based observations with in situ data is currently not possible due to a lack of in situ data in shallow areas. A partial independence between ONNS-retrieved  $\rho_{CDOM}(440)$  and TSM is of high importance in

Formatted: Font: Italic

shallow Arctic shelf waters, such as the Laptev Sea. Using C2X algorithm, resuspension events would result in erroneous estimation of  $\rho_{\text{CDOM}}(443)$ .

Furthermore, the C2X-derived TSM concentration is substantially higher compared to TSM concentration derived by ONNS (Fig 10). Örek et al. (2013) and Heim et al. (2014) report TSM concentrations between 10 and 70 mg L<sup>-1</sup> for Lena River water and up to 18 mg L<sup>-1</sup> in coastal water near the Lena River Delta measured in situ in August 2010. These values are similar to TSM concentrations derived by the ONNS algorithms but lower than C2X algorithm TSM. Considering overestimation of C2X derived  $\rho_{\text{CDOM}}(443)$  and TSM compared to in situ data, the use of neural networks trained for a broad range of constituent concentration likely leads to inaccurate results. Combination of neural networks with narrow concentration ranges and a classification into distinct water types (results of classification shown in Fig. C1, Appendix C), as used in ONNS-algorithm, provide more robust and accurate results in regions with a broad range of water types.

#### 5 Conclusion

In this study, we demonstrate sources and modification of dissolved organic matter (DOM) by analysing  $\mu_{\text{CDOM}}(\lambda)$  characteristics in the fluvial-marine transition zone where the Lena River meets the Laptev Sea. Our results suggest that the  $\mu_{\text{CDOM}}(\lambda)$  spectral slope S350-500 could be useful to identify and distinguish processes that degrade DOM at this transition. Comparisons of  $\mu_{\text{CDOM}}(\lambda)$  characteristics from this study with reported values from a global dataset and western Arctic waters identify DOM sources as primarily terrigenous.

We demonstrate the strength of a large in situ dataset that covers multiple water types for deriving the relationship between the optical DOM properties and DOC concentration in surface water of the Laptev Sea and Lena Delta region. The broad range of DOC concentrations and  $\mu_{\text{CDOM}}(443)$  from river, coastal and offshore water used to develop this model enables the accurate estimation of DOC by  $\mu_{\text{CDOM}}(\lambda)$  in the transition zone between river and seawater. Comparing satellite-retrieved  $\mu_{\text{CDOM}}(440)$ , using the OCRS ONNS algorithm, and in situ  $\mu_{\text{CDOM}}(440)$  demonstrates the performance of the algorithm for these optically complex waters. DOC concentrations calculated from satellite data moderately agreed with in situ DOC measurements ( $r^2$ =0.53), demonstrating the applicability of the DOC- $\mu_{\text{CDOM}}(\lambda)$  relationship from our compiled dataset. ONNS-derived  $\mu_{\text{CDOM}}(440)$  was found to be independent of the suspended sediment concentration. Thus, resuspension events and resulting sediment-rich backscattering waters seem to have no or little influence on the accuracy of ONNS-derived  $\mu_{\text{CDOM}}(440)$ .

The Arctic coastal waters of the Laptev Sea are a key region for the fate of terrestrial DOM and can be monitored synoptically using optical remote sensing with a reasonable accuracy. MERIS-retrieved DOC concentrations presented in this study provide a detailed picture of the spatial distribution of the DOC-rich Lena River water on the Laptev Sea shelf and indicate the rapid changes in the magnitude of DOC concentrations in the surface waters within short time periods. If cloud distribution allows, optical remote sensing provides data of high spatial and temporal resolution to track freshwater pathways in the Arctic Ocean, which is of high interest to the oceanographic community.

Formatted: Font: Italic

### Data Availability

Data has been made available through PANGAEA:

Juhls, Bennet; Hölemann, Jens A; Heim, Birgit; Overduin, Pier Paul; Gonçalves-Araujo, Rafael; Hieronymi, Martin; Fischer, Jürgen (2019): Surface water Dissolved Organic Matter (DOC, CDOM) in the Laptev Sea and Lena River.

5 https://doi.pangaea.de/10.1594/PANGAEA.898813

https://doi.pangaea.org/10.1594/PANGAEA.898813

#### Appendix

### Appendix A

The regression between DOC and  $\rho_{\text{CDOM}}(\lambda)$  was performed for a number of selected wavelengths ( $\lambda$ ) to enable comparisons with other studies. Table A1 shows regression coefficients dependent on wavelengths.

### Appendix B

Performance of all tested OCRS algorithms are shown in Fig. B1. Whereas ONNS and C2X provide reasonable results close to the 1 to 1 line compared to in situ data, other algorithms (C2R, C2RCC, FUB/WeW) underestimate  $a_{CDOM}(\lambda)^{sat}$  strongly.

#### Appendix C

15 The percentage membership of each pixel is then used to calculate a weighted sum of different neural networks trained for different OWTs. Figure C1 shows the OWTs of the processed scenes from Figure 6 & 7. It is visible that Lena River plume in the coastal waters was classified as OWT 1 (see 1 in Fig. C1) which indicates optically complex, extreme absorbing and high scattering water. The plume between the Lena Delta and the New Siberian Island is characterized by OWT 5 (see 2 in Fig. C1a & b), which indicated a mixture of high absorbing and scattering waters. The Lena River water plume with generally case 2, optically complex waters is sharply delineated to the west, where different water types occur (see 3 in Fig. C1 & b). Waters west of this plume were classified as OWT 11 displaying Case 1 waters (generally optically deep waters) waters with a small fraction of absorbing waters.

### **Author Contributions**

B.J., P.P.O. developed the study design. Field work and data collection for this study was conducted by B.J. in all used years, by P.P.O. in 2016 and 2017, J.H. in 2010, 2011, 2013 and 2014 and by B.H. in 2010, 2013, 2014, 2015. M.H. processed satellite data with the ONNS algorithm. B.J. compiled and processed all presented data and prepared the manuscript with editorial contributions from all co-authors.

Formatted: Font: Italic

### Competing interests

The authors declare that they have no conflict of interest

#### Acknowledgements

This work was financially supported by Geo.X, the Research Network for Geosciences in Berlin and Potsdam, (grant # SO\_087\_GeoX). Transdrift expedition data were obtained within the framework of the Laptev Sea System project, supported by the German Federal Ministry of Education and Research (BMBF grant # 03G0833) and the Ministry of Education and Science of the Russian Federation. Part of this study was funded by the Japan Aerospace Exploration Agency (JAXA) GCOM-C project (Contract #: 16RSTK-007867) to AM. We thank the crews and colleagues on-board the research vessels involved in sampling. We are grateful to the colleagues of the Russian-German Otto-Schmidt-Laboratory in St. Petersburg for support and accessibility of laboratory instruments for sample analysis. We are eminently thankful to Dr. Hajo Krasemann for processing MERIS scenes with the ONNS algorithm and the valuable discussion. NCEP-Reanalysis data were provided by the NOAA-CIRES Climate Diagnostics Center, Boulder, CO, USA at http://www.cdc.noaa.gov/. Furthermore, thanks towe thank Antje Eulenburg for laboratory analysis of several parameter datasets. The and Philippe Massicotte for sharing his dataset with us to compare our data. Projects from the EU Horizon 2020 programme (Nunataryuk project (, grant # 773421) provided support for and from the BMBF-NERC's Changing Arctic Ocean programme (CACOON, NERC: grant # NE/R012806/1, BMBF: grant # 03F0806A) supported discussions with within a larger group of experts. The authors are grateful to Dr. Piotr Kowalczuk and

Formatted: English (United Kingdom)

### References

Amon, R. M. W., Rinehart, A. J., Duan, S., Louchouarn, P., Prokushkin, A., Guggenberger, G., Bauch, D., Stedmon, C., 20 Raymond, P. A., Holmes, R. M., McClelland, J. W., Peterson, B. J., Walker, S. A. and Zhulidov, A. V.: Dissolved organic matter sources in large Arctic rivers, Geochim. Cosmochim. Acta, 94, 217–237, doi:10.1016/J.GCA.2012.07.015, 2012.

one anonymous reviewer for their constructive comments, which helped to improve the manuscript.

Antoine, D., Hooker, S. B., Bélanger, S., Matsuoka, A. and Babin, M.: Apparent optical properties of the Canadian Beaufort Sea & Camp; amp; ndash; Part 1: Observational overview and water column relationships, Biogeosciences, 10(7), 4493–4509, doi:10.5194/bg-10-4493-2013, 2013.

25 Antoine, D., Babin, M., Berthon, J.-F., Bricaud, A., Gentili, B., Loisel, H., Maritorena, S. and Stramski, D.: Shedding Light on the Sea: André Morel's Legacy to Optical Oceanography, Annu. Rev. Mar. Sci, 6, 1–21, doi:10.1146/annurev-marine-010213-135135, 2014.

Asmala, E., Bowers, D. G., Autio, R., Kaartokallio, H. and Thomas, D. N.: Qualitative changes of riverine dissolved organic matter at low salinities due to flocculation, J. Geophys. Res. Biogeosciences, 119(10), 1919–1933, doi:10.1002/2014JG002722, 2014.

Formatted: Indent: Left: 0 cm, First line: 0 cm

Babin, M., Stramski, D., Ferrari, G. M., Claustre, H., Bricaud, A., Obolensky, G. and Hoepffner, N.: Variations in the light absorption coefficients of phytoplankton, nonalgal particles, and dissolved organic matter in coastal waters around Europe, J. Geophys. Res., 108(C7), 3211, doi:10.1029/2001JC000882, 2003.

Bailey, S. W. and Werdell, P. J.: A multi-sensor approach for the on-orbit validation of ocean color satellite data products,

5 doi:10.1016/j.rse.2006.01.015, 2006.

Benner, R. and Kaiser, K.: Biological and photochemical transformations of amino acids and lignin phenols in riverine dissolved organic matter, Biogeochemistry, 102(1–3), 209–222, doi:10.1007/s10533-010-9435-4, 2011.

Bricaud, A., Morel, A. and Prieur, L.: Absorption by dissolved organic matter of the sea (yellow substance) in the UV and visible domains 1, Limnol. Oceanogr., 26(1), 43–53, doi:10.4319/lo.1981.26.1.0043, 1981.

- Brockmann, C., Roland, Peters, M., Stelzer, K., Sabine and Ruescas, A.: Evolution of the C2RCC Neural Network for Sentinel-2 and 3 for the Retrieval of Ocean Color Products in Normal and Extreme Optically Complex Waters, Living Planet Symp., Vol. 740. [online] Available from: http://brockmann.urracreative.com/wp-content/uploads/2017/11/sco1\_12brockmann.pdf (Accessed 1 February 2018), 2016.
- Bröder, L., Tesi, T., Salvadó, J. A., Semiletov, I. P., Dudarev, O. V. and Gustafsson, Ö.: Fate of terrigenous organic matter across the Laptev Sea from the mouth of the Lena River to the deep sea of the Arctic interior, Biogeosciences, 13(17), 5003–5019, doi:10.5194/bg-13-5003-2016, 2016.
  - Bröder, L., Andersson, A., Tesi, T., Semiletov, I. and Gustafsson, Ö.: Quantifying Degradative Loss of Terrigenous Organic Carbon in Surface Sediments Across the Laptev and East Siberian Sea, Global Biogeochem. Cycles, 33(1), 85–99, doi:10.1029/2018GB005967, 2019.
- 20 Brüchert, V., Bröder, L., Sawicka, J. E., Tesi, T., Joye, S. P., Sun, X., Semiletov, I. P. and Samarkin, V. A.: Carbon mineralization in Laptev and East Siberian sea shelf and slope sediment, Biogeosciences, 15(2), 471–490, doi:10.5194/bg-15-471-2018, 2018.
  - Camill, P.: Permafrost Thaw Accelerates in Boreal Peatlands During Late-20th Century Climate Warming, Clim. Change, 68(1–2), 135–152, doi:10.1007/s10584-005-4785-y, 2005.
- 25 Carder, K. L., Steward, R. G., Harvey, G. R. and Ortner, P. B.: Marine humic and fulvic acids: Their effects on remote sensing of ocean chlorophyll, Science (80-.)., 34(1), 68–81, 1989.
  - Cauwet, G. and Sidorov, I.: The biogeochemistry of Lena River: organic carbon and nutrients distribution, Mar. Chem., 53(3–4), 211–227, doi:10.1016/0304-4203(95)00090-9, 1996.
  - Cooper, L. W., Benner, R., McClelland, J. W., Peterson, B. J., Holmes, R. M., Raymond, P. A., Hansell, D. A., Grebmeier, J.
- 30 M. and Codispoti, L. A.: Linkages among runoff, dissolved organic carbon, and the stable oxygen isotope composition of seawater and other water mass indicators in the Arctic Ocean, J. Geophys. Res. Biogeosciences, 110(G2), n/a n/a, doi:10.1029/2005JG000031, 2005.

Delwart, S., Preusker, R., Bourg, L., Santer, R., Ramon, D. and Fischer, J.: MERIS in-flight spectral calibration, Int. J. Remote Sens., 28(3–4), 479–496, doi:10.1080/01431160600821119, 2007.

Formatted: Indent: Left: 0 cm, First line: 0 cm

- Dittmar, T. and Kattner, G.: The biogeochemistry of the river and shelf ecosystem of the Arctic Ocean: a review, Mar. Chem., 483, 103–120, doi:10.1016/S0304-4203(03)00105-1, 2003.
- Doerffer, R. and Schiller, H.: The MERIS Case 2 water algorithm, Int. J. Remote Sens., 28(3–4), 517–535, doi:10.1080/01431160600821127, 2007.
- 5 Fasching, C., Behounek, B., Singer, G. A. and Battin, T. J.: Microbial degradation of terrigenous dissolved organic matter and potential consequences for carbon cycling in brown-water streams, Sci. Rep., 4(1), 4981, doi:10.1038/srep04981, 2015.
  - Fichot, C. G. and Benner, R.: A novel method to estimate DOC concentrations from CDOM absorption coefficients in coastal waters, Geophys. Res. Lett., 38(3), doi:10.1029/2010GL046152, 2011.
  - Fichot, C. G. and Benner, R.: The spectral slope coefficient of chromophoric dissolved organic matter (S 275-295) as a tracer of terrigenous dissolved organic carbon in river-influenced ocean margins, Limnol. Oceanogr., 57(5), 1453–1466, doi:10.4319/lo.2012.57.5.1453. 2012.
  - Fichot, C. G. and Benner, R.: The fate of terrigenous dissolved organic carbon in a river-influenced ocean margin, Global Biogeochem. Cycles, 28(3), 300–318, doi:10.1002/2013GB004670, 2014.
  - Fichot, C. G., Kaiser, K., Hooker, S. B., Amon, R. M. W., Babin, M., Bélanger, S., Walker, S. A. and Benner, R.: Pan-Arctic distributions of continental runoff in the Arctic Ocean, Sci. Rep., 3(1), 1053, doi:10.1038/srep01053, 2013.
  - Freeman, C., Evans, C. D., Monteith, D. T., Reynolds, B. and Fenner, N.: Export of organic carbon from peat soils, Nature, 412(6849), 785–785, doi:10.1038/35090628, 2001.
  - Frey, K. E. and Smith, L. C.: Amplified carbon release from vast West Siberian peatlands by 2100, Geophys. Res. Lett., 32(9), L09401, doi:10.1029/2004GL022025, 2005.
- 20 Gonçalves-Araujo, R., Stedmon, C. A., Heim, B., Dubinenkov, I., Kraberg, A., Moiseev, D. and Bracher, A.: From Fresh to Marine Waters: Characterization and Fate of Dissolved Organic Matter in the Lena River Delta Region, Siberia, Front. Mar. Sci., 2, 108, doi:10.3389/fmars.2015.00108, 2015.
  - Gordeev, V. V., Martin, J. M., Sidorov, I. S. and Sidorova, M. V.: A reassessment of the Eurasian river input of water, sediment, major elements, and nutrients to the Arctic Ocean, Am. J. Sci., 296(6), 664–691, doi:10.2475/ajs.296.6.664, 1996.
- 25 Granskog, M. A., Stedmon, C. A., Dodd, P. A., Amon, R. M. W., Pavlov, A. K., de Steur, L. and Hansen, E.: Characteristics of colored dissolved organic matter (CDOM) in the Arctic outflow in the Fram Strait: Assessing the changes and fate of terrigenous CDOM in the Arctic Ocean, J. Geophys. Res. Ocean., 117(C12), doi:10.1029/2012JC008075, 2012.
  - Green, S. A. and Blough, N. V.: Optical absorption and fluorescence properties of chromophoric dissolved organic matter in atural waters, Limnol. Oceanogr., 39(8), 1903–1916, doi:10.4319/lo.1994.39.8.1903, 1994.
- 30 Guo, W., Stedmon, C. A., Han, Y., Wu, F., Yu, X. and Hu, M.: The conservative and non-conservative behavior of chromophoric dissolved organic matter in Chinese estuarine waters, Mar. Chem., 107(3), 357–366, doi:10.1016/J.MARCHEM.2007.03.006, 2007.
  - Hansell, D. A., Carlson, C. A. and Amon, R. M. W.: Biogeochemistry of marine dissolved organic matter. [online] Available from:

Formatted: Indent: Left: 0 cm, First line: 0 cm

https://books.google.de/books?hl=de&lr=&id=7iKOAwAAQBAJ&oi=fnd&pg=PP1&dq=Hansell,+D.,+2002.+DOC+in+the+global+ocean+carbon+cycle.+In:+Hansell,+D.A.,+Craig,+C.A.+(Eds.),+Biogeochemistry+of+Marine+Dissolved+Organic+Matter.+Academic+press,+California.&ots=kx (Accessed 19 February 2019), 2002.

Hansen, A. M., Kraus, T. E. C., Pellerin, B. A., Fleck, J. A., Downing, B. D. and Bergamaschi, B. A.: Optical properties of dissolved organic matter (DOM): Effects of biological and photolytic degradation, Limnol. Oceanogr., 61(3), 1015–1032, doi:10.1002/lno.10270. 2016.

Heim, B., Abramova, E., Doerffer, R., Günther, F., Hölemann, J., Kraberg, A., Lantuit, H., Loginova, A., Martynov, F., Overduin, P. P. and Wegner, C.: Ocean colour remote sensing in the southern Laptev Sea: evaluation and applications, Biogeosciences, 11(15), 4191–4210, doi:10.5194/bg-11-4191-2014, 2014.

Helms, J. R., Stubbins, A., Ritchie, J. D., Minor, E. C., Kieber, D. J. and Mopper, K.: Absorption spectral slopes and slope ratios as indicators of molecular weight, source, and photobleaching of chromophoric dissolved organic matter, Limnol. Oceanogr., 53(3), 955–969, doi:10.4319/lo.2008.53.3.0955, 2008.

Helms, J. R., Mao, J., Stubbins, A., Schmidt-Rohr, K., Spencer, R. G. M., Hernes, P. J. and Mopper, K.: Loss of optical and molecular indicators of terrigenous dissolved organic matter during long-term photobleaching, Aquat. Sci., 76(3), 353–373, doi:10.1007/s00027-014-0340-0, 2014.

Hieronymi, M.: Spectral band adaptation of ocean color sensors for applicability of the multi-water biogeo-optical algorithm ONNS, Opt. Express, <a href="mailto:submitted27(12">submitted27(12</a>), A707, doi:10.1364/OE.27.00A707, 2019.

Hieronymi, M., Krasemann, H., Müller, D., Brockmann, C., Ruescas, A., Stelzer, K., Bouchra, N., Ruddick, K., Simis, S., Tilstone, G., Steinmetz, F. and Regner, P.: Ocean Color Remote Sensing of Extreme Case 2 Waters, spectrum, 2, 4. [online] Available from: https://odnature.naturalsciences.be/downloads/publications/1991hieronymi\_withheader.pdf (Accessed 3 September 2018), 2016.

Hieronymi, M., Müller, D. and Doerffer, R.: The OLCI Neural Network Swarm (ONNS): A Bio-Geo-Optical Algorithm for Open Ocean and Coastal Waters, Front. Mar. Sci., 4, 140, doi:10.3389/fmars.2017.00140, 2017.

Hill, V. J.: Impacts of chromophoric dissolved organic material on surface ocean heating in the Chukchi Sea, J. Geophys. Res.,

25 113(C7), C07024, doi:10.1029/2007JC004119, 2008.

20

30

Holmes, R. M., McClelland, J. W., Raymond, P. A., Frazer, B. B., Peterson, B. J. and Stieglitz, M.: Lability of DOC transported by Alaskan rivers to the Arctic Ocean, Geophys. Res. Lett., 35(3), L03402, doi:10.1029/2007GL032837, 2008.

Hu, C., Feng, L., Lee, Z., Davis, C. O., Mannino, A., McClain, C. R. and Franz, B. A.: Dynamic range and sensitivity requirements of satellite ocean color sensors: learning from the past, Appl. Opt., 51(25), 6045, doi:10.1364/AO.51.006045, 2012.

Jerlov, N. G.: Optical Oceanography, in Optical Oceanography Elsevier, pp. 156–161., 1969.

Kaiser, K., Benner, R. and Amon, R. M. W.: The fate of terrigenous dissolved organic carbon on the Eurasian shelves and export to the North Atlantic, J. Geophys. Res. Ocean., 122.1, 4–22, doi:10.1002/2016JC012380, 2017.

Kattner, G., Lobbes, J. ., Fitznar, H. ., Engbrodt, R., Nöthig, E.-M. and Lara, R. .: Tracing dissolved organic substances and

Formatted: Indent: Left: 0 cm, First line: 0 cm

Formatted: Indent: Left: 0 cm, First line: 0 cm

nutrients from the Lena River through Laptev Sea (Arctic), Mar. Chem., 65(1–2), 25–39, doi:10.1016/S0304-4203(99)00008-0, 1999.

Kutser, T., Koponen, S., Kallio, K. Y., Fincke, T. and Paavel, B.: Bio-optical Modeling of Colored Dissolved Organic Matter, in Bio-optical Modeling and Remote Sensing of Inland Waters, pp. 101–128, Elsevier., 2017.

Lobbes, J. M., Fitznar, H. P. and Kattner, G.: Biogeochemical characteristics of dissolved and particulate organic matter in Russian rivers entering the Arctic Ocean, Geochim. Cosmochim. Acta, 64(17), 2973–2983, doi:10.1016/S0016-7037(00)00409-9, 2000.

Makarewicz, A., Kowalczuk, P., Sagan, S., Granskog, M. A., Pavlov, A. K., Zdun, A., Borzycka, K. and Zabłocka, M.: Characteristics of chromophoric and fluorescent dissolved organic matter in the Nordic Seas, Ocean Sci, 14, 543–562, doi:10.5194/os-14-543-2018, 2018.

Mann, P. J., Davydova, A., Zimov, N., Spencer, R. G. M., Davydov, S., Bulygina, E., Zimov, S. and Holmes, R. M.: Controls on the composition and lability of dissolved organic matter in Siberia's Kolyma River basin, J. Geophys. Res. Biogeosciences, 117(G1), doi:10.1029/2011JG001798, 2012.

Mann, P. J., Spencer, R. G. M., Hernes, P. J., Six, J., Aiken, G. R., Tank, S. E., McClelland, J. W., Butler, K. D., Dyda, R. Y. and Holmes, R. M.: Pan-Arctic Trends in Terrestrial Dissolved Organic Matter from Optical Measurements, Front. Earth Sci., 4, 25, doi:10.3389/feart.2016.00025, 2016.

Mannino, A., Russ, M. E. and Hooker, S. B.: Algorithm development and validation for satellite-derived distributions of DOC and CDOM in the U.S. Middle Atlantic Bight, J. Geophys. Res., 113(C7), C07051, doi:10.1029/2007JC004493, 2008.

Massicotte, P., Asmala, E., Stedmon, C. and Markager, S.: Global distribution of dissolved organic matter along the aquatic continuum: Across rivers, lakes and oceans, Sci. Total Environ., 609, 180–191, doi:10.1016/J.SCITOTENV.2017.07.076, 2017.

Matsuoka, A., Hill, V., Huot, Y., Babin, M. and Bricaud, A.: Seasonal variability in the light absorption properties of western-Arctic waters: Parameterization of the individual components of absorption for ocean color applications, J. Geophys. Res., 116(C2), C02007, doi:10.1029/2009JC005594, 2011.

25 Matsuoka, A., Bricaud, A., Benner, R., Para, J., Sempéré, R., Prieur, L., Bélanger, S. and Babin, M.: Tracing the transport of colored dissolved organic matter in water masses of the Southern Beaufort Sea: relationship with hydrographic characteristics, Biogeosciences, 9(3), 925–940, doi:10.5194/bg-9-925-2012, 2012.

Matsuoka, A., Ortega-Retuerta, E., Bricaud, A. and Babin, M.: Characteristics of colored dissolved organic matter (CDOM) in the Western Arctic Ocean: Relationships with microbial activities, Deep Sea Res. Part II Top. Stud. Oceanogr., 118, 44–52,

30 doi:10.1016/J.DSR2.2015.02.012, 2015.

Matsuoka, A., Boss, E., Babin, M., Karp-Boss, L., Hafez, M., Chekalyuk, A., Proctor, C. W., Werdell, P. J. and Bricaud, A.: Pan-Arctic optical characteristics of colored dissolved organic matter: Tracing dissolved organic carbon in changing Arctic waters using satellite ocean color data, Remote Sens. Environ., 200, 89–101, doi:10.1016/J.RSE.2017.08.009, 2017.

Mobley, C. D., Stramski, D., Bissett, W. P. and Boss, E.: Optical modeling of ocean waters: is the Case 1-Case 2 classification

Formatted: Indent: Left: 0 cm, First line: 0 cm

Formatted: Indent: Left: 0 cm, First line: 0 cm

still useful?, Oceanography, 17, 60-67, doi:10.5670/oceanog.2004.48, 2004.

Morel, A. and Prieur, L.: Analysis of variations in ocean color1, Limnol. Oceanogr., 22(4), 709–722, doi:10.4319/lo.1977.22.4.0709, 1977.

Nelson, N. B. and Siegel, D. A.: Chromophoric DOM in the Open Ocean, in Biogeochemistry of Marine Dissolved Organic

- 5 Matter, pp. 547-578, Elsevier., 2002.
  - Nelson, N. B., Carlson, C. A. and Steinberg, D. K.: Production of chromophoric dissolved organic matter by Sargasso Sea microbes, doi:10.1016/j.marchem.2004.02.017, 2004.
  - Nelson, N. B., Siegel, D. A., Carlson, C. A., Swan, C., Smethie, W. M. and Khatiwala, S.: Hydrography of chromophoric dissolved organic matter in the North Atlantic, Deep Sea Res. Part I Oceanogr. Res. Pap., 54(5), 710–731,
- 10 doi:10.1016/J.DSR.2007.02.006, 2007.
  - Opsahl, S. and Benner, R.: Distribution and cycling of terrigenous dissolved organic matter in the ocean, Nature, 386(6624), 480–482, doi:10.1038/386480a0, 1997.
  - Örek, H., Doerffer, R., Röttgers, R., Boersma, M. and Wiltshire, K. H.: Contribution to a bio-optical model for remote sensing of Lena River water, Biogeosciences, 10, 7081–7094, doi:10.5194/bg-10-7081-2013, 2013.
- 15 Raymond, P. A., McClelland, J. W., Holmes, R. M., Zhulidov, A. V., Mull, K., Peterson, B. J., Striegl, R. G., Aiken, G. R. and Gurtovaya, T. Y.: Flux and age of dissolved organic carbon exported to the Arctic Ocean: A carbon isotopic study of the five largest arctic rivers, Global Biogeochem. Cycles, 21(4), n/a n/a, doi:10.1029/2007GB002934, 2007.
  - Schroeder, T. and Schaale, M.: MERIS Case-2 Water Properties Processor, Version 1.0.1, Institute for Space Sciences, Freie Universität Berlin (FUB), http://www.brockmann-consult.de/beam/software/plugins/FUB-WeWWater-1.0.1.zip, 2005.
- 20 Spencer, R. G. M., Aiken, G. R., Butler, K. D., Dornblaser, M. M., Striegl, R. G., Hernes, P. J., Spencer, R. G. M., Aiken, G. R., Butler, K. D., Dornblaser, M. M., Striegl, R. G. and Hernes, P. J.: Utilizing chromophoric dissolved organic matter measurements to derive export and reactivity of dissolved organic carbon exported to the Arctic Ocean: A case study of the Yukon River, Alaska Utilizing chromophoric dissolved organic matter measurements to , Alaska, Geophys. Res. Lett, 36, doi:10.1029/, 2009.
- 25 Stedmon, C. A., Amon, R. M. W., Rinehart, A. J. and Walker, S. A.: The supply and characteristics of colored dissolved organic matter (CDOM) in the Arctic Ocean: Pan Arctic trends and differences, Mar. Chem., 124(1–4), 108–118, doi:10.1016/J.MARCHEM.2010.12.007, 2011.
  - Syed, T. H., Famiglietti, J. S., Zlotnicki, V. and Rodell, M.: Contemporary estimates of Pan-Arctic freshwater discharge from GRACE and reanalysis, Geophys. Res. Lett., 34(19), L19404, doi:10.1029/2007GL031254, 2007.
- 30 Thibodeau, B., Bauch, D., Kassens, H. and Timokhov, L. A.: Interannual variations in river water content and distribution over the Laptev Sea between 2007 and 2011: The Arctic Dipole connection, Geophys. Res. Lett., 41(20), 7237–7244, doi:10.1002/2014GL061814, 2014.
  - Vantrepotte, V., Danhiez, F.-P., Loisel, H., Ouillon, S., Mériaux, X., Cauvin, A. and Dessailly, D.: CDOM-DOC relationship in contrasted coastal waters: implication for DOC retrieval from ocean color remote sensing observation, Opt. Express, 23(1),

Formatted: Indent: Left: 0 cm, First line: 0 cm

33, doi:10.1364/OE.23.000033, 2015.

Del Vecchio, R. and Blough, N. V: Photobleaching of chromophoric dissolved organic matter in natural waters: kinetics and modeling, Mar. Chem., 78(4), 231–253, doi:10.1016/S0304-4203(02)00036-1, 2002.

Walker, S. A., Amon, R. M. W. and Stedmon, C. A.: Variations in high-latitude riverine fluorescent dissolved organic matter:

5 A comparison of large Arctic rivers, J. Geophys. Res. Biogeosciences, 118(4), 1689–1702, doi:10.1002/2013JG002320, 2013.

Weishaar, J. L., Aiken, G. R., Bergamaschi, B. A., Fram, M. S., Roger, F. and Mopper, K.: Evaluation of Specific Ultraviolet

Absorbance as an Indicator of the Chemical Composition and Reactivity of Dissolved Organic Carbon, ,
doi:10.1021/ES030360X, 2003.

Yang, D., Kane, D. L., Hinzman, L. D., Zhang, X., Zhang, T. and Ye, H.: Siberian Lena River hydrologic regime and recent change, J. Geophys. Res. Atmos., 107(D23), ACL 14-1-ACL 14-10, doi:10.1029/2002JD002542, 2002.

### Figures

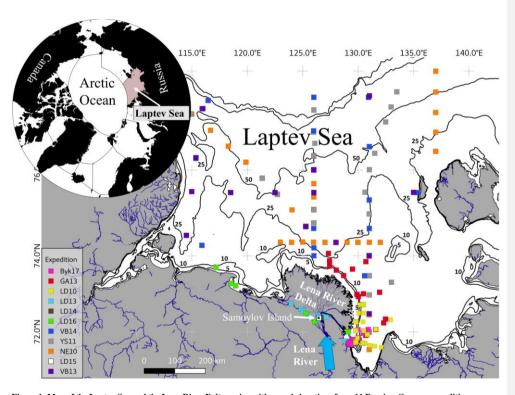


Figure 1: Map of the Laptev Sea and the Lena River Delta region with sample locations from 11 Russian-German expeditions; upper left map shows the Arctic Ocean and the location of the Laptev Sea on the Russian Arctic shelf. Bathymetry is shown by black contour lines and water depth in meters.

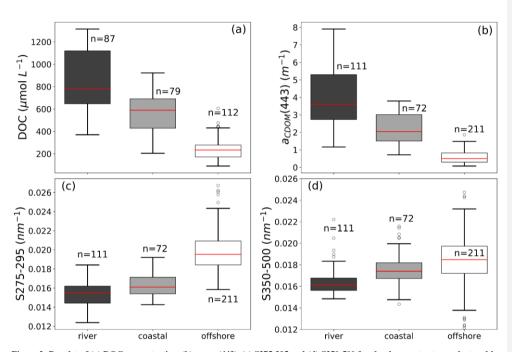


Figure 2: Boxplot of (a) DOC concentration, (b)  $\rho_{CDOM}(443)$ , (c) S275-295 and (d) S350-500 for the three water types clustered by salinity (river <0.2, coastal <16, offshore >16); the red line indicates median of each water type.

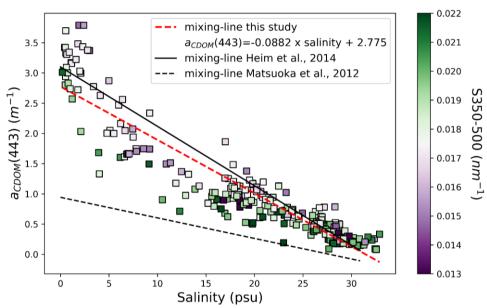


Figure 3: Relationship between  $a_{\rm CDOM}(443)$  and salinity (n=283, r<sup>2</sup>=0.87) for all available water sampled from less than 10 m water depth and a salinity >0.2; color of data-points indicates S350-500; red dashed line shows the linear fit representing the mixing line between Salinity and  $a_{\rm CDOM}(443)$  within this dataset. Solid black line shows the reported mixing-line from Heim et al. (2014) and dashed black line to one from Matsuoka et al. (2012) (adapted to  $a_{\rm CDOM}(443)$  using Eq. (2) and a constant slope of 0.018.

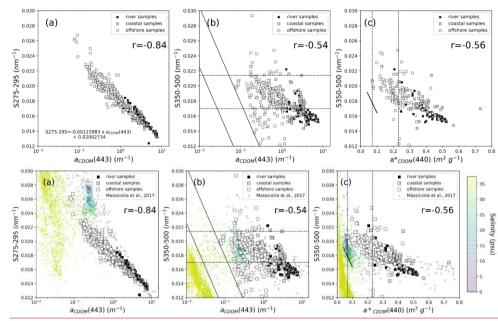


Figure 4: (a) Relationship between  $a_{\rm CDOM}(443)$  and S275-295; (b)  $a_{\rm CDOM}(443)$  vs. S350-500 with 95% confidence intervals of regressions of western Arctic coastal waters (dashed lines) and for western Arctic oceanic water (solid lines) reported by Matsuoka et al. (2011), (2012), (c)  $a^*{\rm CDOM}(440)$  vs. S350-500 with dashed lines representing the borders of  $a^*{\rm CDOM}(440)$  for oceanic waters report by Nelson and Siegel (2002) and solid line shows the reported relationship between  $a^*{\rm CDOM}(440)$  and S350-500 from Matsuoka et al. (2012). Circles show global data from Massicotte et al. (2017) where colors indicate the salinity.

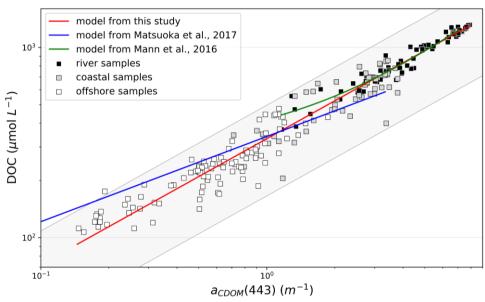


Figure 5: Relationship between  $\mu_{\rm CDOM}(443)$  and DOC (r<sup>2</sup>=0.96). Red line shows the derived model from this dataset. The blue line shows the relationship from Matsuoka et al. (2017) for a pan-Arctic dataset for offshore and coastal waters. The green line shows the relationship for Lena River water from Mann et al. (2016). The filled grey area shows the 50% error range. Note that the axes are displayed in log-scale.

Formatted: Font: Italic

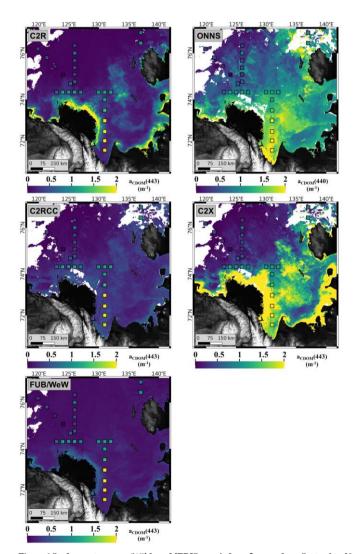


Figure 6 Surface water  $\varrho_{CDOM}(\lambda)^{sat}$  from MERIS mosaic from 5 scenes from September 2010 (scenes listed in Table 12) for all tested OCRS algorithms (C2R, ONNS, C2RCC, C2X, FUB/WeW). Squares show in situ  $\varrho_{CDOM}(443)$  ( $\varrho_{CDOM}(440)$  for ONNS) with colors according to same color scale as satellite data.

Formatted: Font: Italic
Formatted: Font: Italic
Formatted: Font: Italic

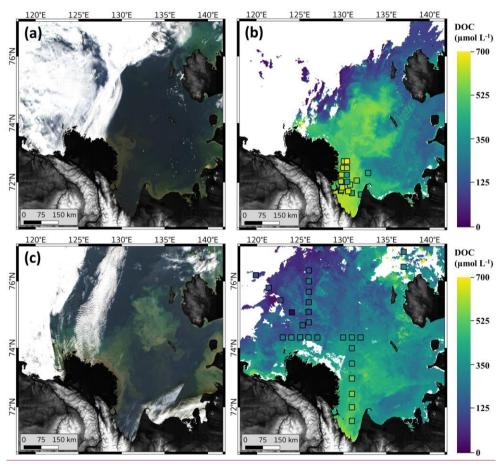


Figure 7: (a) Quasi-true color image from 5: August 2010; (b) Surface water ONNS-DOC concentration from satellite mosaics from 3 August 2010-08-03 to 5 August 2010-08-05. (c) Quasi-true color image from 7: September 2010. d) Surface water ONNS-DOC concentration from satellite mosaics from 7 September 2010-09-07 and 18 September 2010-09-18 to 20 September 2010-09-20. Squares in (b) and (d) squares indicate in situ concentrations with same color scale as satellite data.

Formatted: Subtitle Char, Font:

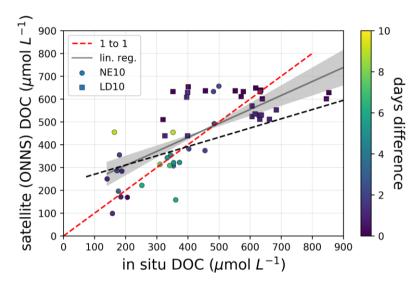


Figure 8: Comparison of in situ DOC and ONNS-derived DOC. The dark gray line shows a linear regression (r²=0.53, slope=0.61, n=50). The gray area represents the 95 % confidence interval. The red line indicates 1:1 correspondence. Days difference (symbol color) shows the temporal offset between the satellite scene and in situ water sampling. The dashed black line shows the satellite DOC concentration calculated by using the DOC-acdom(443) relationship from Matsuoka et al. (2017).

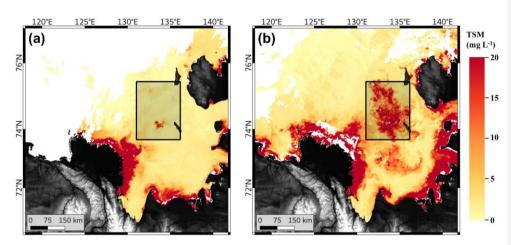


Figure 9: ONNS-derived TSM concentration for satellite mosaics from (a) August 2010 and (b) September 2010. Shallow water area is highlighted by black square.

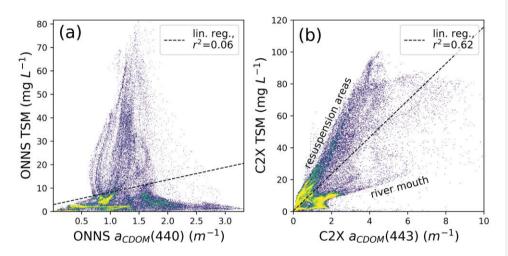


Figure 10 Relationship between (a) ONNS retrieved  $\rho_{CDOM}(440)$  and TSM concentration and (b) C2X retrieved  $\rho_{CDOM}(440)$  and TSM concentration for the MERIS scene from 0.7.09.7 September 2010. Relationship, using other scenes from September, is not varying significantly (18.09. September 2010: ONNS r<sup>2</sup>=0.22 and C2X r<sup>2</sup>=0.55, 19.09.2010: ONNS r<sup>2</sup>=0.23 and C2X r<sup>2</sup>=0.67, 20.09. September 2010: ONNS r<sup>2</sup>=0.03 and C2X r<sup>2</sup>=0.66)

Formatted: Font: Italic
Formatted: Font: Italic

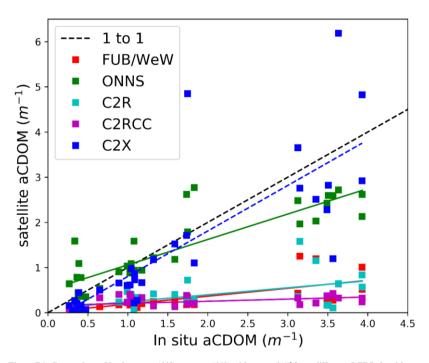


Figure B1: Comparison of in situ  $\rho_{CDOM}(443)$  or  $\rho_{CDOM}(440)$  with  $\rho_{CDOM}(\lambda)^{sat}$  from different OCRS algorithms.

Formatted: Font: Italic
Formatted: Font: Italic
Formatted: Font: Italic

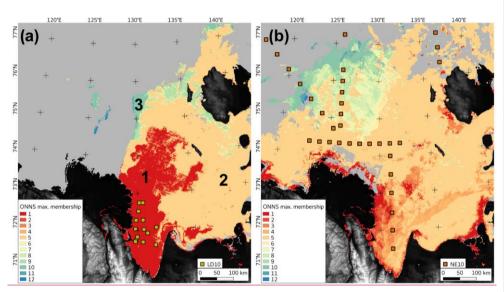


Figure C1: Optical water types from ONNS fuzzy logic classification for (a) average of  $\frac{3 \text{ August}}{2010-08-03}$  to  $\frac{5 \text{ August}}{2010-08-05}$  and (b) average of  $\frac{7 \text{ September}}{2010-09-07}$  and  $\frac{18 \text{ September}}{2010-09-18}$  to  $\frac{20 \text{ September}}{2010-09-20}$ .

**Tables** 

Table 12: List of MERIS scenes used in this study

Scene name	Date, Time (UTC)	Match-up with
MER_RR1PRBCM20100803_020534_000005942091_00404_44045_0005	2010-08-03 02:05	LD10
MER_RR1PRBCM20100804_031401_000005942091_00419_44060_0004	2010-08-04 03:14	LD10
MER_RR1PRBCM20100805_024241_000005942091_00433_44074_0003	2010-08-05 02:42	LD10
MER_RR1PRBCM20100907_034618_000005942092_00405_44547_0002	2010-09-07 03:46	NE10
MER_RR1PRBCM20100918_030140_000005942093_00061_44704_0006	2010-09-18 03:01	NE10
MER_RR1PRBCM20100919_023010_000005942093_00075_44718_0007	2010-09-19 02:30	NE10
MER_RR1PRBCM20100920_033916_000005942093_00090_44733_0008	2010-09-20 03:39	NE10

Table 21: Expedition focus regions, years and region. Mean and standard deviation of hydrographic and DOM parameters. The number of samples between DOC and <u>\( \rho\_{\text{CDOM}}(443) \) differs for some expeditions and "n.a," indicates that no DOC measurements were made.</u>

Expedition (Code)	Focus region	Year	Season	S (psu)	DOC (µmol L <sup>-1</sup> )	а <sub>сром</sub> (443) (m <sup>-1</sup> )	S275-295 (nm <sup>-1</sup> )	S350-500 (nm <sup>-1</sup> )
Lena 2010 (LD10)	Coastal	2010	Aug.	6.03 ± 6.59	563 ± 156 (n=29) <sub>1</sub>	3.39 ± 0.27 (n=9)	0.0152 ± 0.0006	0.0167 ± 0.0019
Transdrift XVIII (NE10)	Central shelf	2010	Sept.	$23.6 \pm 6.6$	n.a.	0.66 ± 0.46 (n=107)	$0.0196 \pm 0.0016$	$0.0175 \pm 0.0028$
Transdrift XIX (YS11)	Central shelf	2011	Aug. & Sept.	$19.6\pm3.6$	239 ± 55 (n=29)	0.75 ± 0.21 (n=26)	$0.0193 \pm 0.0009$	$0.0161 \pm 0.0129$
Lena 2013 (LD13)	Lena River	2013	July & Aug.	$0.01\pm0.05$	695 ± 77 (n=28) <sub>2</sub>	3.25 ± 0.6 (n=28)	$0.016 \pm 0.0007$	$0.0166 \pm 0.0006$
Gonçalves-Araujo et al., (2015) (GA 13)	Coastal	2013	July & Aug.	$14.2\pm9.4$	398 ± 155 (n=59) <sub>4</sub>	1.5 ± 0.86 (n=42) <sub>3</sub>	$0.017 \pm 0.0015$	$0.0181 \pm 0.00158$
Transdrift XXI (VB13)	Central shelf	2013	Aug. & Sept.	$22.6 \pm 6.9$	n.a.	0.71 ± 0.55 (n=19)	$0.0201 \pm 0.0023$	$0.0184 \pm 0.0017$
Lena 2014 (LD14)	Lena River	2014	May & June	$0.01\pm0.05$	1049 ± 248 (n=50)	5.66 ± 1.85 (n=44)	$0.0145 \pm 0.001$	$0.0159 \pm 0.0005$
Transdrift XXII (VB14)	Central shelf	2014	Sept.	$28.3\pm2.9$	176 ± 53 (n=46)	$0.36 \pm 0.19 \text{ (n=47)}$	$0.0208 \pm 0.0021$	$0.0196 \pm 0.00164$
Lena 2015 (LD15)	Lena River	2015	July & Sept.	$0.01\pm0.05$	n.a.	2.66 ± 0.72 (n=12) <sub>5</sub>	$0.0167 \pm 0.0009$	$0.0166 \pm 0.0006$
Lena 2016 (LD16)	Lena River & Coastal	2016	Aug. & Sept.	$7.3 \pm 9.5$	499 ± 164 (n=17)	2.47 ± 1.22 (n=35)	$0.0164 \pm 0.001$	$0.0164 \pm 0.0014$
Bykovsky 2017 (Byk17)	Coastal	2017	June & July	$1.3\pm2.2$	675 ± 61 (n=22)	2.6 ± 0.69 (n=22)	$0.0161 \pm 0.0009$	$0.019 \pm 0.0013$

1doi.org/10.1594/PANGAEA.842220

2doi.org/10.1594/PANGAEA.844928

5 3doi.org/10.1594/PANGAEA.875748

4doi.org/10.1594/PANGAEA.842221

5doi.org/10.1594/PANGAEA.875754

Formatted: Font: Italic

Formatted: Font: Italic

Table 3: Performance of tested OCRS algorithms for  $\rho_{\text{CDOM}}(\lambda)^{\text{sat}}$  with in situ  $\rho_{\text{CDOM}}(443)$  or  $\rho_{\text{CDOM}}(440)$ . Note that not all OCRS algorithms are developed for the highly absorbing waters (high  $\rho_{\text{CDOM}}(\lambda)$ ) found in the Arctic coastal region.

OCRS algorithm	n	slope	intercept	r²	Rt	SIQR	%MPE	RMSE
ONNS	34	0.571	0.493	0.716	0.679	0.217	58.39	0.436
C2R	34	0.157	0.087	0.329	3.23	0.075	223.38	0.277
C2RCC	34	0.048	0.157	0.271	3.23	0.093	223.05	0.097
C2X	34	1.023	-0.212	0.652	1.09	0.224	100.0	0.919
FUB/WeW	34	0.178	0.013	0.545	3.76	0.057	276.49	0.2

-{	Formatted: Font: Italic
1	Formatted: Font: Italic
Y	Formatted: Font: Italic
Y	Formatted: Font: Italic

Table A1: Coefficients selected wavelengths for	$a_{\text{CDOM}}(\lambda)$ using the equation $b * a \text{CDOM}(\lambda)^c b * a \text{CDOM}(\lambda)^c$

$\lambda \text{ of } a_{\text{CDOM}}(\lambda))$	b	<u>c</u>
254	20.9462548427	0.8483590018983822
350	97.4272121688	0.7260394049434391
375	136.577758485	0.715114349676763
440	322.902097112	0.6667788739998305
443	333.695151626	0.6640204313768572

Formatted: Font: Italic

Formatted: Font: Italic