

# An algorithm for detecting *Trichodesmium* surface blooms in the South Western Tropical Pacific

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Abstract. Trichodesmium, a major colonial cyanobacterial nitrogen fixer, forms large blooms in NO3-depleted tropical oceans and enhances CO<sub>2</sub> sequestration by the ocean due to its ability to fix dissolved dinitrogen. Thus, its importance in C and N cycles requires better estimates of its distribution at basin to global scales. However, existing algorithms to detect them from satellite have not yet been successful in the South Western Tropical Pacific (SP). Here, a novel algorithm (TRI-CHOdesmium SATellite) based on radiance anomaly spectra (RAS) observed in SeaWiFS imagery, is used to detect Trichodesmium during the austral summertime in the SP (5° S-25° S 160° E-170° W). Selected pixels are characterized by a restricted range of parameters quantifying RAS spectra (e.g. slope, intercept, curvature). The fraction of valid (noncloudy) pixels identified as Trichodesmium surface blooms in the region is low (between 0.01 and 0.2%), but is about 100 times higher than deduced from previous algorithms. At daily scales in the SP, this fraction represents a total ocean surface area varying from 16 to 48 km<sup>2</sup> in Winter and from 200 to 1000 km<sup>2</sup> in Summer (and at monthly scale, from 500 to 1000 km<sup>2</sup> in Winter and from 3100 to 10 890 km<sup>2</sup> in Summer with a maximum of 26 432 km<sup>2</sup> in January 1999). The daily distribution of Trichodesmium surface accumulations in the SP detected by TRICHOSAT is presented for the period 1998-2010 which demonstrates that the number of selected pixels peaks in November-February each year, consistent with field observations. This approach was validated



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with in situ observations of *Trichodesmium* surface accumulations in the Melanesian archipelago around New Caledonia, Vanuatu and Fiji Islands for the same period.

# 1 Introduction

The balance between oceanic N<sub>2</sub> fixation and nitrogen losses (denitrification) in the ocean has been postulated to regulate atmospheric CO<sub>2</sub> over geological time via the enhancement of biological sequestration of CO<sub>2</sub> (Falkowski, 1997; Gruber and Sarmiento, 1997; Deutsch et al., 2007; Capone and Knapp, 2007). Unicellular (Zehr et al., 2001; Montoya et al., 2004; Church et al., 2008, 2009; Zehr et al., 2011) and filamentous cyanobacteria (Carpenter, 1983; Capone et al., 1997, 2005; LaRoche and Breitbarth, 2005; Bonnet et al., 2009; Moisander et al., 2010) incorporate this form of "new" nitrogen (N) into the marine food web of tropical and subtropical oceans (Berman-Frank et al., 2004; Mahaffey et al., 2005; Mulholland, 2007). N2 fixation is considered to be the major source of new N in stratified, oligotrophic tropical oceans (Capone et al., 1997; Karl et al., 2002). Future change in sea surface temperature (Breitbarth et al., 2006) or/and CO<sub>2</sub> concentration are expected to stimulate photosynthesis (C fixation) and N<sub>2</sub> fixation by filamentous cyanobacteria, particularly by Trichodesmium spp. (Barcelos et al., 2007; Hutchins et al., 2007; Kranz et al., 2009; Levitan et al., 2010). This enhancement of Trichodesmium growth could compensate the decreased growth of other phytoplankton owing to a presumed decrease of nitrate supply.

Trichodesmium spp. can form extensive blooms which have been observed for a long time in the South Western Pacific Ocean (SP), particularly in austral summer (Dandonneau and Gohin, 1984). The presence of three major archipelagos (New Caledonia, Vanuatu and Fiji-Tonga in the SP region (5° S-25° S, 150° E-170° W, Fig. 1a) and their potential for oceanic iron enrichment from land may trigger these cyanobacterial blooms (Bowman and Lancaster, 1965; Mantas et al., 2011) as Trichodesmium blooms require large quantities of iron (Rubin et al., 2011). The blooms appear as brown or orange meandering patterns around those archipelagos (Dupouy et al., 1988; Dupouy, 1990; Tenório, 2006; Hashihama et al., 2010), are clearly detected from the International Space Shuttle (December 2001 around Tonga Islands), and were recently highlighted by the NASA Ocean Color Website (Feldman et al., 2010). Blooms are also regularly observed in waters of the Dampier Archipelago, the Arafura Sea (Neveux et al., 2006) and off the Great Barrier Reef (Kuchler and Jupp, 1988; Furnas, 1989; Bell et al., 1999). Trichodesmium was reported in the Western North Pacific (Shiozaki et al., 2009; Kitajima et al., 2009; Konno et al., 2010). Nevertheless, observations in the SP contradict the recently published global map of *Trichodesmium* analogs based on ecosystem model results that indicate a predominance of higher densities in the North Pacific than in the South Western Pacific Ocean (Monteiro et al., 2010).

Estimating the occurrence of Trichodesmium surface blooms from satellite is a major challenge, but will be required for large-scale estimates of nitrogen fixation (e.g., Westberry et al., 2005; Westberry and Siegel, 2006). Regional algorithms have been successfully applied on the Atlantic continental shelf (Subramaniam et al., 2002), off Canary Islands (Ramos et al., 2005) as well as the Indian coast (Sarangi et al., 2004). Global algorithms have also been recently developed for estimating phytoplankton community structure in the surface oceans. The PHYtoplankton SATellite (PHYSAT) algorithm was successful in identifying Synechococcus-like cyanobacteria with maxima in the tropics (Alvain et al., 2005). The Scanning Imaging Absorption Spectrometer for Atmospheric Cartography (SCHIA-MACHY) sensor also detects a cyanobacterial signal within the same latitudinal band (Bracher et al., 2009). However, all algorithms generally fail at identifying seasonality of Trichodesmium blooms in the SP and none retrieve the relatively high abundance of Trichodesmium surface blooms expected and observed in situ during austral summer (November to March). Here we develop an algorithm to detect Trichodesmium surface blooms in the SP which is based on Sea-WiFS radiance anomalies (similar to PHYSAT) and apply it to SeaWiFS data from 1997-2010.

# 2 Material and methods

# 2.1 Data

## 2.1.1 In situ observations

Bloom observations (Fig. 2) used here include those collected during the maritime survey of the Economic Exclusive Zone of New Caledonia by the French Navy (aerial and shipboard observations) and those obtained during scientific cruises on the R/V Alis between New Caledonia, Vanuatu, Fiji and Wallis and Futuna Islands (15° S to 23° S, 160° E to 180° E; Dupouy et al., 2004a). For most of the observations by the French Navy and the R/V Alis, surface water samples were collected with a bucket and preserved onboard in a 4% formalin solution. Identification of diazotroph morphological groups was made under a Zeiss microscope at IRD Nouméa (LOCEAN laboratory). In addition, more detailed identification and abundance of filamentous diazotrophs was obtained from inverted microscopy between October 2001 and October 2003 (nine Diapalis cruises as part of the DI-Azotrophy in a Pacific ZONe program) (Tenório, 2006). In these instances, surface sampling was done with 8 L Niskin bottles (sometimes with bucket sampling for comparison). During the Diapalis cruises, chlorophyll-and phycoerythrin measurements were also obtained from spectrofluorometry (Lantoine and Neveux, 1997; Neveux et al., 1999; Neveux et al., 2006). A slightly higher concentration of chlorophylla (Chl-a) was observed from bucket samples compared to those from Niskin samples.

# 2.1.2 Satellite ocean color data

For the development of the new algorithm, representative global SeaWiFS Level3 data (R2010) were selected for summer and winter seasons, and included normalized water leaving radiance, nLw ( $\lambda$ ), at 6 channels (412, 443, 490, 510, 555, and 670 nm) as well as SeaWiFS chlorophyll and the diffuse attenuation coefficient at 490 nm (K490 product). From these data, a Look Up Table (LUT) relating K490 to remote sensing reflectance was created (see Sect. 2.2). However, to avoid compositing artifacts upon application of the LUT, daily SeaWiFS Level-2 GAC (R2010) between 1998–2010 and covering the Western Pacific Ocean (160° E–160° W/25° N–25° S area), were used.

# 2.2 Methods

The general approach was to define a spectral radiance anomaly from SeaWiFS nLw( $\lambda$ ) that was specifically related to *Trichodesmium* surface blooms. It aimed at removing the first order variability in ocean color caused by chlorophyll concentration while preserving the variability that may be specifically caused by individual phytoplankton species or other optically active components. This objective is similar to the PHYSAT classification method (Alvain et al., 2005)



**Fig. 1. (a)** Map showing limits of the Western Pacific Ocean (WP:  $25^{\circ}$  N– $25^{\circ}$  S/ $160^{\circ}$  E– $160^{\circ}$  W) and of the Southern Pacific Ocean domains (SP:  $5^{\circ}$  S– $25^{\circ}$  S/ $150^{\circ}$  E– $170^{\circ}$  W). (b) Mean SeaWiFS composite image of chlorophyll-*a* (mg m<sup>-3</sup>) in the SP Ocean in February 2003 (austral Summer) with observations of *Trichodesmium* surface accumulations for December 2002–March 2003. Main islands are indicated in yellow: New Caledonia ( $20-22^{\circ}$  S,  $165^{\circ}$  E), Vanuatu ( $15-20^{\circ}$  S,  $168^{\circ}$  E), Fiji ( $17^{\circ}$  S,  $180^{\circ}$  E) and South Tonga Islands ( $21^{\circ}$  S,  $175^{\circ}$  W). (c) French Navy observations of *Trichodesmium* surface blooms (1998-2010) from Table 1 as empty black circles, with: light blue – aerial observations; red – small form filaments (named *T. erythraeum* spp. after Tenório, 2006); magenta – mix of small *T. erythraeum* and long forms (filaments of *Trichodesmium thiebautii* and *T. tenue*); yellow – mix of *T. tenue* and *Katagnymene* sp.



**Fig. 2.** Photographs of the January–February 2004 *Trichodesmium* slick as seen from long line airplanes (aerial observation), and from the ship of the French Navy *La Glorieuse* (shipboard observation with bucket sample) reported in Table 1.

that was initially developed for discrimination of major phytoplankton groups in Case 1 waters. Waters dominated by diatoms, *Prochlorococcus*, *Synechococcus*-like cyanobacteria and haptophytes could thus be classified according to their radiance anomaly spectra (RAS):

$$nL^*w(\lambda) = nLw(\lambda) / < nLw(\lambda) >$$
(1)

where  $\langle nLw(\lambda) \rangle$  is the expectation of nLw at a given chlorophyll concentration (Chl-*a*), computed as the average of a large global SeaWiFS dataset, and nL\*w is the radiance anomaly relative to this average. The main advantage of PHYSAT is to provide thresholds allowing characterization of RAS at each pixel. PHYSAT uses a LUT of  $\langle nLw(\lambda) \rangle$  as a function of Chl-*a*.

Here, we employed a LUT based on the diffuse attenuation coefficient at 490 nm (SeaWiFS "K490"). K490 has the advantage over chlorophyll of being computed straightforwardly while operational SeaWiFS chlorophyll estimates result from switching between three wavelength ratios. This new LUT was built using four daily, global Level3 images from 15 February, 15 May, 15 August and 15 November 2002, in order to encompass a seasonal cycle. The LUT contains the likelihood of SeaWiFS radiances, noted < nLw ( $\lambda$ )<sub>K490</sub> >, for all K490 values in the 0.0186 m<sup>-1</sup> to 0.2499 m<sup>-1</sup> interval. Radiance anomaly spectra (RAS) are then computed as

$$nL^* w_{K490}(\lambda) = nLw(\lambda) / \langle nLw(\lambda)_{K490} \rangle$$
(2)

where  $nL^*w(\lambda)$  are the SeaWiFS radiance estimates. For consistency with past work, we checked that results are equivalent to when Chl-*a* is used as in PHYSAT. Radiance anomaly spectra  $nL^*w_{K490}$ , hereafter denoted RAS, can thus be considered as equivalent to PHYSAT nLw\*.

There is another significant difference between the approach used here compared with the previous PHYSAT effort. Instead of defining RAS thresholds and associating them with pigment classes (and thus, different phytoplankton groups), the new algorithm defines quantitative shape and magnitude criteria of the RAS itself. Eighteen summer scenes around New Caledonia in 2003 and 2004 were selected as they correspond to periods where slicks and high abundance (> 5000 trichomes. $L^{-1}$ ) of *Trichodesmium* were observed in the surface ocean (Tables 1 and 2). In 2003, Sea-WiFS level2-GAC from 6, 13, 18 January, 1, 4, 9, 13, 16, 18, 21, 28 February, 2, 6 March; Yeardays: 6, 13, 18, 32, 35, 40, 44, 47, 49, 52, 59, 62, 66) corresponded to slick observations by the French Navy from December 2002 to February and March 2003 (Table 1). The gap between December 2002 and February 2003 may be due to the January 2003 cyclone "Beni" that prevented field observations. In 2004, SeaWiFS Level2 GAC from 10, 18, 23 February, and 3, 17 March; Yeardays 41, 48, 53, 63, 77), corresponded to slick observations from January to March 2004 (Table 1). The definition of the RAS of Trichodesmium surface blooms on the Sea-WiFS satellite imagery was generated for pixels around New Caledonia and Fiji from these 18 scenes.

The criteria were chosen in such a way that they permit reconstruction of the RAS spectra. For example, RAS spectra could be described by the coefficients of a polynomial fit (degree 2) (Fig. 3a). We thus retained the following criteria for an objective description of the *Trichodesmium* RAS (1) slope of the linear fit of RAS vs wavelength (S), and (2) the ordinate of the polynomial fit for which the tangent is parallel to linear fit (Yt). Additional criteria related to the shape of the RAS were defined as the major positive and major negative deviations relative to the second degree polynomial fit (largest "bump" or largest "trough", respectively, Fig. 3a).

### 3 Results

#### 3.1 Field observations

Aerial and shipboard visual observations of *Trichodesmium* surface blooms (Fig. 1b, c) around New Caledonia between 1998 and 2004 are presented in Table 1 and average cruise and transect surface biomass and abundance are presented in Table 2.

Generally, slick sizes were a few tens of meters wide and two to three nautical miles long (shipboard or aircrafts photographs, Fig. 2). Twice in the series (November 1998, November 1999) large areas of 30 km<sup>2</sup> were covered by slicks, and once in February 2004, the whole area between New Caledonia and Vanuatu (300 km<sup>2</sup>) was covered by numerous elongated slicks well detected by longline aircraft. *Trichodesmium* was responsible for the majority of the slick observations. Only one preserved sample (12 December 2002) contained small pumices originating from Vanuatu or



**Fig. 3.** (a) Descriptive parameters to characterize the radiance anomaly spectra (RAS) relative to K490 for *Trichodesmium* detection in surface oceanic waters for a SeaWiFS pixel: S = slope of the linear fit; Yt = ordinate of the second degree fit for which tangent is parallel to linear fit; "Bump" and "Trough" are the wavelengths of the major positive and major negative deviations relative to the second degree polynomial fit (largest "bump" or largest "trough", respectively) (b) Ranges of S and Yt for all RAS of all SeaWiFS pixels (black). In orange, specific S and Yt and positions of bumps and troughs schematically shown for RAS of a *Trichodesmium* bloom.

Tonga volcanoes which were mixed with the *Trichodesmium* colonies. Sea-rafted pumice can drift to the west and reach New Caledonia. Some of these rafts reached the Australian coast in October 2002, approximately 7–8 months after a submarine eruption in the Tonga Trench (Bryan et al., 2004). None of the slick observations corresponded to coral spawning which is responsible for fugitive coastal red waters once a year in New Caledonia. The abundance of *Trichodesmium* spp. in the SP exhibited a strong seasonality as previously pointed out (Dupouy et al., 2004a; Moutin et al., 2005) with the highest number of visual observations (65% or 61 over 93 total observations) over the study period (November 1998 to June 2010) occurring between December and February

**Table 1.** In situ *Trichodesmium* bloom observations for the period 1998–2010 in the South Western Tropical Pacific (NC, New Caledonia). Data from aerial observations, and/or bucket sampling from cruises and various transects made by the French Navy ships and the R/V *Alis*.

Yearday/Year	Date	Latitude	Longitude	Observed	Observed	Estimated	Location in the	Observation
Tearday/ Tear	Date	Lanuae	Longitude	species	form	Slick size	Tropical Pacific	Mean
404/400044		1.00	1 - 0 0 - 0					
101/1998**	11 Apr 1998	17°S	179°E	T.t.	large col.	und.	Fiji Isl.	R/V Revelle, NSF
101/1998*	11 Apr 1998	18°S	1/2° W	1. t.	large col.	und.	Vavau Isi.	F. Navy, J. Cartier
108/1998	18 Nov 1998	22°35′5	168°58 E	und.	und.	nq s.	walpole Isl.	F. Navy aerial
108/1998	18 Nov 1998	24°21′S	170°40′E	und.	und.	nq s.	SENC	F. Navy aerial
329/1998	25 Nov 1998	22°15'5	163°35'E	und.	und.	nq s.	W NC	F. Navy aerial
329/1998	25 Nov 1998	21°20'S	164°10′E	und.	und.	nq s.	W NC	F. Navy aerial
329/1998	25 Nov 1998	19°35′S	160°55′E	und.	und.	30 km²	NW NC	F. Navy aerial
352/1998	18 Dec 1998	22°40′ S	165°50' E	und.	und.	nq s.	SW NC	F. Navy aerial
008/1999	8 Jan 1999	23°S	166°E	und.	und.	nq s.	SWINC	F. Navy aerial
008/1999	8 Jan 1999	24°10′S	166°15′4E	und.	und.	nq s.	SW NC	F. Navy aerial
008/1999	8 Jan 1999	23°50′S	164°20' E	und.	und.	nq s.	SW NC	F. Navy aerial
313/1999	9 Nov 1999	20°S	170°E	und.	und.	30 km²	Vanuatu to NC	R/V Alis (Wespalis)
007/2000	7 Jan 2000	21°49′ S	165°11′ E	und.	und.	nq s.	W NC	F. Navy aerial
007/2000	7 Jan 2000	20°30′ S	161°52′ E	und.	und.	nq s.	W NC	F. Navy aerial
363/2000	28 Dec 2000	19°57′ S	162°58′ E	und.	und.	nq s.	Belep	F. Navy aerial
363/2000	28 Dec 2000	21°20′ S	164°12′ E	und.	und.	nq s.	Poum NC	F. Navy aerial
363/2000	28 Dec 2000	21°48′ S	163°35′ E	und.	und.	nq s.	Poum NC	F. Navy aerial
008/2001	8 Jan 2001	22°20′ S	172°E	und.	und.	nq s.	Hunter Isl.	F. Navy aerial
018/2001	18 Jan 2001	21°11′ S	164°17′E	und.	und.	nq s.	NW Kone, NC	F. Navy aerial
018/2001*	18 Jan 2001	18°31′ S	164°28′ E	T. e., T. t., T. Ten.	large col., green	nq s.	Petri Reefs	F. Navy aerial
23/2001*	23 Jan 2001	22°11′ S	161°79′ E	T. e.	Isolated fil.	nq s.	Coral Sea	F. Navy aerial
23/2001*	23 Jan 2001	$22^{\circ}10'$ S	161°79′ E	T. e.	flocks	Shipb.	Coral Sea	F. Navy, <i>La Moqueuse</i>
29/2001	29 Jan 2001	24°53′ S	161°40′ E	und.	flocks	Shipb.	Coral Sea	F. Navy, <i>La Moqueuse</i>
29/2001	29 Jan 2001	24°47′ S	162°37′ E	und.	flocks	Shipb.	Coral Sea	F. Navy, <i>La Moqueuse</i>
125/2001*	7 May 2001	$20^{\circ}12'$ S	163°29′ E	T. e.	green col.	nq s.	Belep	F. Navy aerial
248/2001	5 Sep 2001	20°08′ S	170°45′ E	und.	und.	nq s.	Anatom	F. Navy aerial
248/2001	5 Sep 2001	20°41′ S	170°16′E	und.	und.	nq s.	Anatom	F. Navy aerial
295/2001*	22 Oct 2001	22°16′ S	167°27′ E	T. e., T. t., K.	flocks	Shipb.	E NC	R/V Alis (Diapalis 1)
285/2001*	3 Nov 2001	20°47′ S	167°03′ E	T. e.	grey col.	nq s.	Lifou Isl.	F. Navy aerial
317/2001*	13 Nov 2001	22°09′ S	167°19′ E	T. e., T. t., K.	und.	nq s.	East Coast	F. Navy, <i>La Glorieuse</i>
317/2001*	13 Nov 2001	22° S	167°29′ E	T. e., T. t., K.	und.	nq s.	Loyalty Channel	F. Navy, <i>La Moqueuse</i>
030/2002*	30 Jan 2002	22°22′ S	166°50′E	T. e.	green col.	nq s.	Uitoe Pass.	F. Navy aerial
030/2002	30 Jan 2002	$22^{\circ}12'$ S	166°01′ E	und.	und.	nq s.	Uitoe Pass.	F. Navy aerial
039/2002	8 Feb 2002	21°26′ S	162°32′ E	und.	und.	nq s.	Chesterfields Isl.	R/V Alis
111/2002*	21 Apr 2002	23°29′ S	162°53′ E	T. e.	orange col.	Shipb.	SW NC	F. Navy, J. Cartier
111/2002*	24 Apr 2002	22°28′ S	169°12′E	T. e.	pink col.	Shipb.	E Walpole Isl.	F. Navy, J. Cartier
189/2002*	8 Jul 2002	19°08′ S	176°41′ W	Т. е.	grey col.	Shipb.	Fiji Isl.	F. Navy, J. Cartier
197/2002	16 Jul 2002	23°03′ S	164°42′ E	und.	und.	Shipb.	W NC	F. Navy, J. Cartier
344/2002*	10 Dec 2002	18°40′ S	168°59′ E	K. + T. e. + T. t.	large col.	nq s.	Erromango Isl.	F. Navy, J. Cartier
345/2002	11 Dec 2002	20°05′ S	167°30′ E	und.	und.	Shipb.	E Lifou Bay	visual obs
346/2002*	12 Dec 2002	19°19′ S	164°51′ E	T. e. $+$ K.	green, grey, pummices	Shipb.	Surprises Isl.	F. Navy, <i>La Glorieuse</i>
347/2002*	13 Dec 2002	19°07′ S	167°20′ E	K. + T. e. + T. t.	large col.	Shipb.	Erromango Isl.	F. Navy, J. Cartier
350/2002*	16 Dec 2002	20°48′ S	170°09′ W	T. ten., K.	grey, long thin fil.	Shipb.	Niue Isl.	R/V Alis
350/2002*	16 Dec 2002	$20^{\circ}51'$ S	170°33′ W	T. ten., K.	grey, long thin fil.	Shipb.	Niue Isl.	R/V Alis
352/2002*	18 Dec 2002	21°11′ S	174°08′ W	T. ten., K.	grey, long thin fil.	Shipb.	Niue Isl.	R/V Alis
352/2002*	18 Dec 2002	21°11′ S	173°57′ W	T. ten., K.	grey, long thin fil.	Shipb.	Niue Isl.	R/V Alis
359/2002	25 Dec 2002	20°11′ S	169°04′ E	und.	und.	und.	W Tanna Isl.	shipboard
038/2003*	5 Feb 2003	21 °S	166°30′ E	T.e.	Brown col.	Shipb.	E NC Loyalty Channel	R/V Alis (Diapalis 07)
048/2003	17 Feb 2003	23°14′ S	165°29′ E	und.	und.	nq s.	Santo Isl.	F. Navy aerial
051/2003	20 Feb 2003	15°04′ S	166°30' E	und.	und.	nq s.	W NC	F. Navy aerial
087/2003*	28 Mar 2003	24°44′ S	163°21′ E	T. e.	pink col.	Shipb.	S NC	F. Navy, J. Cartier
115/2003	25 Apr 2003	1/°5/′S	168°10' E	und.	und.	Shipb.	Efate Isl.	F. Navy, J. Cartier
303/2003	30 Oct 2003	14°50′ S	168° E	und.	und.	Shipb.	Bank Isl.	ship of opportunity
308/2003*	4 Nov 2003	17°39′ S	167°33′ E	1. e.	red col.	Shipb.	Vanuatu	F. Navy, La Moqueuse
309/2003	5 Nov 2003	20° S	166°30′ E	und.	und.	Shipb.	Ouvea Isl.	visual obs
343/2003	9 Dec 2003	20°24′ S	167°51′ E	und.	und.	300 km <sup>2</sup>	500 km Lifou-Vanuatu	R/V Alis
352/2003	18 Dec 2003	24°03′ S	168°02′ E	und.	und.	Shipb.	SE NC	F. Navy, <i>La Glorieuse</i>
017/2004	17 Jan 2004	23°20′ S	168°20′ E	und.	und.	Shipb.	SENC	F. Navy
023/2004	23 Jan 2004	20°16′ S	161° E	und.	und.	Shipb.	NW NC	F. Navy
026/2004*	26 Jan 2004	22°11′ S	167°22′E	T. e.	small orange col.	Shipb.	Loyalty Channel	F. Navy, La Glorieuse
029/2004*	29 Jan 2004	20°20' S	166°07′ E	Т. е.	Large pink flocks	nq s.	Beautemps-Baupré	R/V Alis (PIL)

Yearday/Year	Date	Latitude	Longitude	Observed	Observed	Estimated	Location in the	Observation
			8	species	form	Slick size	Tropical Pacific	Mean
030/2004*	30 Ian 2004	20°17' S	166°17′ F	Те	Large pipk flocks	nas	NE NC	P/V Alis (DII)
030/2004*	1 Eeb 2004	20 17 S	167°35' E	1. с. Те	Large pink flocks	nq s.	NE NC Oua Isl	R/V Alis (FIL)
042/2004	12 Eab 2004	21 20 3 18°20/ S	166°20/E	1. c.	Large plik nocks	nq s.	W Venuetu	E Norre corial
043/2004	12 Feb 2004	10°50/S	160°50′E	und.	und.	liq s. Shinb	w valuatu N NC Balabio Isl	F. INdvy dellal
044/2004	15 Feb 2004	19 30 3	169 34 E	und.	und.	Shipo.	500 km NC Venuetu	Air Vermetn
047/2004	10 Feb 2004	10 49 5	16820/E	uliu. Ta		KIII S.	NE NC asset	All valuatu
059/2004*	28 Feb 2004	21-10-5	108-30 E	1. e. T.	orange coi.	Shipo.	NE NC coast	R/V Alls (Motevas)
059/2004*	28 Feb 2004	20°52′5	165°57 E	I.e.	brown col.	Shipb.	NE NC coast	R/V Alis (Motevas)
060/2004*	29 Feb 2004	18°33′S	166°03' E	1. t. + K.	floating flocks	Shipb.	Vanuatu	R/V Alis (Motevas)
060/2004*	29 Feb 2004	18°20' S	166°02′E	T. t. $+$ K.	green tuffs long fil.	Shipb.	Vanuatu	R/V Alis (Motevas)
060/2004*	29 Feb 2004	17°23′ S	166°04′ E	T. t. + K.	large puffs/tufts, flocks	Shipb.	Vanuatu	R/V Alis (Motevas)
061/2004*	1 Mar 2004	22° S	167° E	Т. е.	White col.	Shipb.	Yate Barrier Reef	F. Navy
064/2004	4 Mar 2004	20°09′ S	168°43′ E	und.	und.	nq s.	Vanuatu	F. Navy aerial
089/2004	29 Mar 2004	17° S	167° E	und.	und.	nq s.	Masquilignes Isl. N Vanuatu	Air Vanuatu
117/2004	26 Apr 2004	20°09′ S	163°01′ E	und.	und.	nq s.	Aircraft	F. Navy aerial
275/2004	1 Oct 2004	21°30′ S	165' E	und.	und.	nq s.	Lifou lsl.	F. Navy aerial
316/2004	11 Nov 2004	18°30′ S	168' E	und.	und.	nq s.	Vanuatu	F. Navy aerial
347/2004	12 Dec 2004	22°29′ S	169°50' E	und.	und.	nq s.	E Pine Isl., Walpole Isl.	F. Navy aerial
033/2005*	2 Feb 2005	20° 07′ S	170° W	T. e. +T. t. + T. Cont.	und.	und.	East Tonga Isl.	Hashihima et al., 2010
040/2005*	9 Feb 2005	18° 02′ S	175° E	T. e. +T. t. + T. Cont.	und.	und.	W Fiji Isl.	Hashihima et al., 2010
090/2007*	30 Mar 2007	22° 49′ S	169° 59' E	T. e. + K. + T. C.	Floating puffs	Shipb.	Walpole Isl.	R/V Kilo Moana cruise
089/2007*	8 Apr 2007	15° S	169° 59′ W	T. e. + K. + T. C.	Floating puffs	Shipb.	N. Fiji Isl.	R/V Kilo Moana cruise
102/2007*	12 Apr 2007	14° 59′ S	178° 45' E	T. e. + K. + T. C.	Surface Bloom	Shipb.	North East Fiji	R/V Kilo Moana cruise
062/2010*	3 Mar 2010	19°11′ S	166°57′ E	T. e.	orange col.	nq s.	Beautemps- Beaupré Reef	F. Navy aerial
062/2010*	3 Mar 2010	19°06′ S	166°07′ E	T. e.	orange col.	ng s.	Beautemps- Beaupré Reef	F. Navy, J. Cartier
102/2010	12 Apr 2010	22°48′ S	165°17′ S	und.	und.	Shipb.	W NC	Ship obs
102/2010	12 Apr 2010	22°06′ S	165°26′ E	und.	und.	Shipb.	idem	Ship obs
141/2010*	21 May 2010	15°19′ S	166°30' E	Т. е.	orange col.	Shipb.	Sabine Bank	R/V Alis (Geodeva4)
300/2010	27 Oct 2010	19° S	165°30' E	und.	und.	Shiph.	WNC	Ship obs
301/2010	28 Oct 2010	22° S	167° E	und.	und.	Shiph.	WNC	Ship obs
307/2010*	3 Nov 2010	19°15′ S	166°47′ E	Т. е.	orange col.	Shiph.	SE Vanuatu	F. Navy, R/V Prairial
307/2010*	3 Nov 2010	19°27′ S	166°52′ E	Те	orange col	Shiph	SE Vanuatu	F Navy R/V Prairial
339/2010	4 Dec 2010	22°12′ S	169°42′ F	und	und	nas	SENC	F Navy aerial
339/2010	4 Dec 2010	21°26′ S	167°19′ E	und	und	nas	WNC	F Navy aerial
339/2010	4 Dec 2010	21° 20° 5 22°12′ S	167°42′ F	und.	und.	ng s.	WNC	F Navy aerial
557/2010	- Dec 2010	22 12 3	107 <del>4</del> 2 E	unu.	unu.	nq s.		1. Havy acrial

Abreviations: T. e., T. t. and T. ten., K., for *Trichodesmium erythraeum, thiebautii*, and *tenue, Katagnymene* spp., respectively. Col. = colonies; fil. = filaments. nq s.: nautical miles slicks, shipb.: Shipboard observations. \* Ground-truthed (microscopy) aerial or shipboard observations are indicated by an asterisk, \*\* E. J. Carpenter, personal communication, 1998

(Table 1). Surface blooms were rarely detected in situ during winter (only one observation of slicks was available in July 2002, at the west of Fiji Islands, Table 1). Nearly every year, surface blooms developed between New Caledonia and Vanuatu and one of these blooms was exceptionally well tracked (February 2004, Table 1). Slicks were first observed in November 2003 near Vanuatu (17.65° S, 167.56° E), in December 2003 at the north and south of New Caledonia, in January (on 26 at 22° S and on 29-30 at 20.33° S/ 166.12° E) then in February 2004 (on 1st around New Caledonia and on 12-16 near Vanuatu and again North of New Caledonia at 19.49.9° S, 169.54° E). The surface bloom persisted after heavy rains and wind-mixing by Category 4 cyclone Ivy on 24 February. Later, it was detected near New Caledonia (on 26 February), and under calm meteorological and sea conditions. Its slick was sampled on 28 February and showed an orange surface scum (around 21° S, New Caledonia) or large flocks of dead colonies (at 18.55° S, 166.05° E, Vanuatu) which disappeared in the evening (17.38° S, 166.07° E) (Motevas cruise, Table 2). In March, white senescent T. erythraeum (1-4 March, at 22° S, 167° E and 20.16° S/168.71° E) and remnant coastal slicks on (29 March) were seen near Vanuatu (17° S, 167° E). In April, remnant slicks were seen nearby Lifou island at the east of the "Grande terre" of New Caledonia (Table 1). Surface slicks were also observed in summer during a watercolumn observational program in the Loyalty Channel (12 October 2001, 5 February 2003 and 2004, see Tables 1 and 2).

Among the pelagic species described in the Pacific region (Revelante and Gilmartin, 1982; Carpenter et al., 1993), a high morphological diversity of filamentous cyanobacteria as described by Lundgren et al. (2005) and Tenório (2006) was observed in our surface samples (Fig. 1c). Colonies were composed of small rafts from 10 to 50 filaments, small in length (noted T. erythraeum), or long and twisted rafts (noted T. thiebautii) of 50-100 filaments. Long, curved filaments composed of cells larger than long, and some thinner filaments with cells 5-6x longer than wide were noted K. pelagica and T. tenue, respectively. The distribution of these four morphotypes is shown in Fig. 1c. There is no evidence that the same *Trichodesmium* genus or species is widespread throughout the tropics contrary to Katagnymene sp. (Lundgren et al., 2005). We tended to find T. erythraeum near the New Caledonia mainland, but elsewhere most of the morphotypes were mixed. During the peak observed

**Table 2.** Average in situ observations in the surface layer (3 m Niskin bottle) of filamentous cyanobacteria during the DIAPAZON Program from Tenório (2006), the Motevas cruise, and in surface bucket samples during the transects made on the French Navy ships from New Caledonia to Tr 1: Vanuatu, Tr 2: Walpole, Tr 3: Vanuatu, Tr 4: Vanuatu, Tr 5: Fiji, Vanuatu, Tr 6: Wallis and Futuna and Vanuatu. Chl*a* = chlorophyll-*a*; PE = phycoerythrin; Chl-*a* > 10 = percentage of Chl-*a* associated with the >10 µm fraction, Cp = attenuation coefficient (m<sup>-1</sup>). Und: undetermined.

Yearday/Year	date DD/MM/YY	cruise name	Chl- $a$ (mg m <sup>-3</sup> )	PE (mg m <sup>-3</sup> )	Chl- <i>a</i> > 10 (%)	Beam attenuation $(m^{-1})$	Trich. Ab. (Trichomes.L <sup>-1</sup> )	Bloom obs
105/1998	15–April 1998	Trichonesia	0.14	und.	20	und.	298 (10000 Fiji Isl.)*	Shipboard
295-304/2001	22-31 October 2001	Diapalis01	0.14	0.16	16	und.	411	Shipboard
344-356/2001	10-22 December 2001	Diapalis02	0.13	0.15	10	0.072	474	no
15-22/2002	15-22 January 2002	Diapalis03	0.1	0.09	8.8	0.062	401	no
92-99/2002	2–9 April 2002	Diapalis04	0.11	0.1	9	0.059	347	no
133-144/2002	13–14 May 2002	Transect 1	0.26	0.83	und.	und.	und.	no
141-148/2002	21–28 May 2002	Diapalis05	0.11	0.23	9.3	0.046	300 (1000 **)	no
217-224/2002	5-12 August 2002	Diapalis06	0.22	0.19	9	0.069	76	no
34-43/2003	3-12 February 2003	Diapalis07	0.23	0.6	53	0.1	>6000	Shipboard
59/2003	28 February 2003	Transect 2	0.29	0.45	und.	und.	und.	und.
71-80/2003	12-21 March 2003	Transect 3	0.29	0.33	und.	und.	und.	und.
107-115/2003	17-25 April 2003	Transect 4	0.21	0.53	und.	und.	und.	no
112-115/2003	22-25 April 2003	Transect 5	0.18	0.44	und.	und.	und.	no
161-165/2003	9–14 Juni 2003	Diapalis08	0.2	0.25	7	0.051	300	no
188-208/2003	7–27 July 2003	Transect 6	0.25	0.09	und.	und.	und.	no
281-289/2003	8-16 October 2003	Diapalis09	0.099	0.08	9	0.057	9	no
59-60/2004	28-29 February 2004 (Niskin)	Motevas	0.48	0.37	70	und.	4000	Shipboard
59-60/2004	28–29 February 2004 (Bucket)	Motevas	0.84	3.4	70	und.	6500	Shipboard

\* E. J. Carpenter, personal communication, 1998, \*\* 1000 in a slick North of Lifou.

*Trichodesmium* abundance in 2004 along a transect from New Caledonia (20–21° S) to Vanuatu (19° S–17° S), short tufts of *T. erythraeum* were observed at the beginning of the transect (NC), while a mix of *T. thiebautii* (50%), *T. tenue* (25%), *T. erythraeum* (15%), and *Katagnymene pelagica* and *spiralis* (10%) dominated populations at the end (Vanuatu). This population change was also seen in change in the fluorescence excitation spectra of phycoerythrin as in Neveux et al. (2006). Mixed assemblages of *T. erythraeum*, *T. thiebautii*, and *T. contortum* filaments were also observed on the 2 and 9 February 2005 around Fiji Islands (Hashihama et al., 2010), while floating puffs and tufts of mixed taxonomy were observed in March 2007 (Biegala, pers. com.). Only *K. pelagica* + *T. tenue* colonies were found isolated near Niue Island at 19° 2′ S 169° 52′ W (Table 1, Fig. 1c).

Surface Trichodesmium abundance and associated biomass (Chl- $a > 10 \,\mu\text{m}$ ) in the Loyalty Channel and along transects between New Caledonia, Vanuatu or Wallis and Futuna indicated a strong seasonal variability (Table 2). Low filament densities characterized the end of the bloom season in April 1998 when Trichodesmium contribution to biomass was reduced (Dupouy et al., 2000; Campbell et al., 2006), as in April 2002 and 2003 (Table 2). High abundance was never observed in May, except in 2002 along transect 1, where phycoerythrin spectral characteristics confirmed the dominance of Trichodesmium between New Caledonia and Vanuatu. At the beginning of the summer season (October), densities were high in 2001 but not in 2003. Trichodesmium abundance was always higher in summer, except during two 2001–2002 Diapalis cruises (December, January). During Motevas in February 2004 (Dupouy et al., 2004b, 2008), the light beam attenuation was high  $(0.1 \text{ m}^{-1})$ , and a maximal *Trichodesmium* contribution to Chl-*a* of 50–70 % coincident with a high density of 5000 filaments.L<sup>-1</sup> was observed with maximal biomass of 1.9 and 14 mg m<sup>-3</sup> for Chl-*a* and phycoerythrin, respectively. Densities were similar to those measured during February 2003 in Diapalis 07 (Tenório, 2006; Neveux et al., 2006; Masotti et al., 2007). The determination of biomass in surface slicks is challenging and requires a specific thin-layer surface sampler. Nevertheless, Chl-*a* concentrations up to 2 mg m<sup>-3</sup> in the ocean and 3 g m<sup>-3</sup> in the New Caledonia lagoon were observed (Tenório, 2006). In winter, *Trichodesmium* abundance was always low and relatively high chlorophyll values were associated with small size algae (low values of the Chl-*a* fraction above 10 µm).

#### 3.2 Detection of *Trichodesmium* in satellite data

In summer 2003 and 2004, the majority of pixels for the region around New Caledonia exhibited similar RAS. These RAS characteristics were examined under the assumption that instances where Chl- $a > 0.2 \text{ mg m}^{-3}$  were dominated by *Trichodesmium* while those with  $< 0.2 \text{ mg m}^{-3}$  were not, similar to in situ observations. For Chl- $a > 0.2 \text{ mg m}^{-3}$ , linear slopes of the RAS varied between -0.005 and 0.008, and the tangent ordinate Yt varied within a range of 0.8 to 1.4. For Chl- $a < 0.2 \text{ mg m}^{-3}$ , the RAS slope varied from -0.005 to 0.012, while Yt also varied between 0.8 to 1.4. A narrow range of slopes S (from -0.0019 to -0.0017) and intercepts



**Fig. 4.** Application of the TRICHOSAT algorithm to satellite data (1997 to 2010) over the large box corresponding to the Western Pacific Ocean (WP:  $25^{\circ}$  N– $25^{\circ}$  S/160° E–160° W) for the interseason (April–May and October) (**a**) all pixels for which Chl-a > 0.2 mg m<sup>-3</sup>; (**b**) pixels satisfying the slope and intercept criteria of the RAS; (**c**) pixels satisfying the shape criteria, (**d**) pixels satisfying all criteria. The main islands of New Caledonia at 20° S, Vanuatu at 15° S, Fiji Islands at 17° S, Hawaii Islands at 20° N are indicated in black Fig. 4d.

Yt (0.9725-1.0175) characterized Trichodesmium pixels (envelope in orange, Fig. 3b) compared to the large range of S and Yt of RAS of all other pixels (envelope in black, Fig. 1b). These ranges corresponded to low but not minimal values of the total slope range (-0.005 to + 0.012), and to a narrow interval of values of the total Yt range (0.8 to 1.4) (Fig. 3b). Moreover, it was found that RAS of pixels corresponding to Trichodesmium surface blooms had a specific shape. These RAS spectra were characterized by: (1) lack of a "bump" at 555 nm (flat RAS or trough at 555 nm) and (2) always a "bump" at 670 nm and never a trough at 670 nm (Fig. 3b). Criteria for 412, 443, 490 and 510 nm were rather neutral. No weighting of these criteria was necessary for the selection of pixels which approach this ideal shape. The criteria of the RAS for the 555 nm and 670 nm SeaWiFS channels were essential while the criteria for other wavelengths were less useful. On the contrary, quantitative criteria of the RAS defined as in Fig. 3b were discriminant. Ultimately, it appeared that the special RAS shape and quantitative criteria was independent of the Chl-a concentration in the pixels.

The application of *Trichodesmium* RAS criteria (TRI-CHOdesmium SATellite algorithm: TRICHOSAT) to all SeaWiFS Level2 data from 1997 to 2010 within the whole Western Pacific ocean region  $(25^{\circ} \text{ N}-25^{\circ} \text{ S} \text{ and } 160^{\circ} \text{ E} 160^{\circ} \text{ W}$ , noted WP) is shown as composites in Fig. 4 for the interseason (April–May, October). The application of the shape criteria and the quantitative criteria separately were not sufficient to discriminate *Trichodesmium* surface bloom pixels (Fig. 4b and c). The TRICHOSAT algorithm finally selected the pixels which satisfy both criteria (Fig. 4d), i.e. the intersection of the two groups selected by the shape criteria and the quantitative criteria. The resulting composite Fig. 4d shows that the majority of selected *Trichodesmium* pixels is in the SP. Note that the algorithm selection differs markedly from the distribution of pixels with Chl-*a*  concentration greater than  $0.2 \,\mathrm{mg}\,\mathrm{m}^{-3}$  (Fig. 4a) as there are no *Trichodesmium* pixels in the extensive equatorial upwelling maximum, and only few pixels in the northern part of the Pacific Ocean. *Trichodesmium* flagged pixels are not necessarily associated with high chlorophyll content pixels, similar to Westberry and Siegel (2006).

In order to get statistically coherent results for the comparison of the percentage of *Trichodesmium* pixels identified for each year and season, it was verified that a sufficient number of processed SeaWiFS Level2 GAC images  $(5 \times 10^4 - 1 \times 10^6$  pixels with quasi equivalent numbers of non-cloudy valid pixels for each season) were analyzed (Fig. 5).

*Trichodesmium* bloom distributions estimated by TRI-CHOSAT for the WP are shown as composites over 12 years for each of the three seasons (winter, interseason, and summer) in Fig. 6. The increase in selected *Trichodesmium* pixels from austral winter (Fig. 6a) to the interseason (Fig. 6b) to austral summer (Fig. 6c) in the SP is visually evident. Although there is a relatively high response of TRICHOSAT between 1998 and 1999 during boreal winter in the northern Pacific (November–December 1998 (in yellow); January–March 1999 (in black)) around 160° W, no *Trichodesmium* pixels were retrieved during the same time of year between 2000–2010.

Figure 7a shows the temporal evolution of the percentage of *Trichodesmium* bloom pixels, the number of *Trichodesmium* bloom pixels divided by the total number of valid (non-cloudy) pixels x 100, identified by TRICHOSAT on a monthly basis. The algorithm was applied to the WP and to the SP domains. Regular peaks were observed from December–February nearly every year over the 12-year period examined, albeit the monthly maximum percentage of retrieved *Trichodesmium* pixels exhibited strong inter-annual variations. For the SP box, the percentage was above 0.2 % in 1999 and in 2004–2005 and dropped to 0.01 % in winter. At



**Fig. 5.** Statistics of the number of SeaWiFS Level2 GAC images used to determine the spatio-temporal distribution of *Trichodesmium* accumulations in the SP between 1997 and 2010 by year and season. Seasons are defined as: austral summer (November to March); austral winter (June to September); interseason (April–May and October).

the monthly timescale, this fraction represents a total number of Trichodesmium bloom pixels varying from 31 to 62 in winter and from 193 to 1652 in summer (maximum in January 1999) compared to a number of valid (non-cloudy) pixels varying between  $200 \times 10^3$  and  $10^6$  pixels. This is equivalent to monthly surface areas varying between 500 to 1000 km<sup>2</sup> in winter and from 3100 to 10 890 km<sup>2</sup> in summer (with a maximum of 26432 km<sup>2</sup> in January 1999). For the larger WP box, the percentage was much reduced with a maximum of 0.03%, because there were much less *Trichodesmium* pixels detected in the northern half of the WP domain. The mean monthly chlorophyll concentration for the SP is also shown. Note that only a few *Trichodesmium* peaks correspond to a secondary chlorophyll maximum, which further illustrates the independence of bloom occurrence and chlorophyll concentration.

The mean seasonal cycle of *Trichodesmium* bloom coverage in the SP for the 1997–2010 period is shown in Fig. 8. Over 12 years, *Trichodesmium* bloom maxima were observed in January and February with relatively high inter-annual variation. Similarly, the 12-y average monthly percentage of slick observations (from Table 1, and Moutin et al., 2005 for observations before 2004), peaks between January and February.

TRICHOSAT was also applied to single daily Level2 GAC images around New Caledonia and Vanuatu and for short periods representative of summer and winter months (Fig. 9). From the 10 to the 22 of February 2003, TRI-CHOSAT selected pixels spread out between Vanuatu and the northwestern part of New Caledonia and Fiji (Fig. 9a). Two observations from the French Navy coincide with TRI-CHOSAT pixels. From the 9 to the 15 of June 2003, no pixels were detected around New Caledonia (Fig. 9b). The few *Trichodesmium* pixels at the southern limit of the equatorial upwelling between 7° S and 5° S could correspond to observations of *Trichodesmium* blooms in the southern and northern convergence zones of the upwelling (Lebouteiller et al., 1992; Blanchot, personal communication, 2004).

The comparison between in situ observations of slicks (summed by month from Table 1) and the percentage of *Trichodesmium* bloom pixels detected on each single level2 GAC by TRICHOSAT in the SP for the total 1998–2010 period is shown in Fig. 10. The striking coincidence between the number of observations of surface slicks (from 1 to 6 between October 2003 and February 2004) and the peak of percentage of pixels screened by TRICHOSAT is the result of favorable observation conditions in the SP. Despite the reduced number of observations during the 2003–2004 period, the maximum percentage of *Trichodesmium* bloom pixels generally corresponds to a significant number (> 2) of observed slicks (Fig. 10).

#### 4 Discussion

#### 4.1 General considerations of the algorithm

#### 4.1.1 A rather linear RAS spectrum

TRICHOSAT identifies pixels for which the RAS is characterized by a narrow range of S (small negative numbers) and of Yt (values near 1) which implies a relatively linear RAS spectrum compared with the total range of S and Yt found within the whole Pacific Ocean. Shape criteria (bumps and troughs) of the RAS are also essential as the intersection between shape and RAS quantitative criteria is required for the successful selection of Trichodesmium bloom pixels (Fig. 4b, c, d). This means that the RAS spectra of *Trichodesmium* blooms are not so different to what is expected at a given chlorophyll concentration. Westberry et al. (2005) also found remarkably similar bulk reflectance spectra for cases which contained moderate amounts of Trichodesmium compared to those where it was absent. The RAS though differ from those of other phytoplankton groups defined by the PHYSAT approach (Alvain et al., 2005).

#### 4.1.2 A rather weak relationship with biomass

The RAS is by definition, independent of chlorophyll concentration (second order anomaly). Therefore, it is not surprising that selected pixels correspond to a large range of Chl-*a* values, from 0.07 to  $0.3 \text{ mg m}^{-3}$  in a single Level2 GAC image. It has already been shown that chlorophyll associated with surface accumulations of *Trichodesmium* is highly variable. Also, underestimation of chlorophyll in the presence of *Trichodesmium* by SeaWiFS due to a strong



**Fig. 6.** Application of the TRICHOSAT algorithm to satellite data (1997 to 2010) over the large box corresponding to the Western Pacific Ocean (WP:  $25^{\circ}$  N– $25^{\circ}$  S/160° E–160° W); (a) austral winter (June to September); (b) interseason (April–May and October); (c) austral summer (November to March). The main islands of New Caledonia at 20° S, Vanuatu at 15° S, Fiji Islands at 17° S, Hawaii Islands at 20° N are indicated in grey.



**Fig. 7.** (a) Monthly percentage of valid pixels identified as *Trichodesmium* when applying the TRICHOSAT algorithm to SeaWiFS Level2 imagery (4 km × 4 km). Results are shown for the Southern Pacific Ocean box (SP: 5° S–25° S, 150° E–190° E/170° W) in red and for the WP (WP: 25° N–25° S/160° E–160° W) as black. *Trichodesmium* blooms occur regularly during the austral summer and peak in February. SeaWiFS chlorophyll-a for SP also shown as green line (note that the monthly chlorophyll is smoothed compared to chlorophyll concentrations in pixels of individual level2-GAC images) (b) GSM-derived ACDM absorption coefficient (m<sup>-1</sup>) (grey line) and scaled particulate backscattering coefficient (m<sup>-1</sup>) (dark blue line).



**Fig. 8.** (a) Histogram representing the mean annual cycle of percentage *Trichodesmium* bloom pixels  $(\pm 1\sigma)$  over the 12 years (1998–2010) of the SeaWiFS acquisition period; (b) Histogram representing the mean annual number of in situ slick observations (Nb, from Table 1).

package effect in filaments and colonies has been observed (Subramaniam et al., 1999; Dupouy et al., 2008). As TRICHOSAT probably screens pixels containing high *Trichodesmium* concentrations mixed in the upper oceanic layer or forming surface accumulations, this might introduce scatter to the relationship between reflectance and chlorophyll concentration.

#### 4.1.3 Comparison with previous algorithms

The percentage of TRICHOSAT selected pixels in the New Caledonia region (Figs. 7, 8, 10) is low (maximum 0.2% of total valid pixels). However, TRICHOSAT was designed to detect a specific case of Trichodesmium bloom when it is concentrated within a few mm of the sea surface and visible by eye. Under these circumstances, densities are approximately between  $17\,000\,\mathrm{trichomes.L^{-1}}$ and 39 10<sup>6</sup> trichomes.L<sup>-1</sup> (Devassy et al., 1978). Assuming an accumulation which contains  $\sim 3 \text{ g m}^{-3}$  Chl-*a* distributed over a 1 mm thickness, this is equivalent to an integrated concentration of  $3 \text{ mg m}^{-2}$  of Chl-*a* just due to *Trichodesmium*. If the bloom occupies an area of  $100 \text{ m}^2$ , i.e. the 1/160000of the pixel size, the mean Chl-a concentration linked to Tri*chodesmium* in the pixel is  $0.018 \text{ mg m}^{-2}$ . Supposing that the rest of the phytoplankton represents on average  $0.1 \text{ mg m}^{-3}$ , we need about  $500 \,\mathrm{m}^2$  of concentrated accumulation within the pixel to double the chlorophyll concentration. The probability of finding Trichodesmium bloom pixels is low to begin with, much less to observe a  $500 \text{ m}^2$  concentrated patch within a pixel. Nevertheless, the algorithms of Subramaniam et al. (2002) and Westberry et al. (2005) (hereafter denoted as W05) detect even fewer pixels (100 times less). In the SP, the W05 algorithm retrieves a majority of highly reflective



**Fig. 9.** Spatial distributions of *Trichodesmium* bloom pixels retrieved with TRICHOSAT in the SP box ( $5^{\circ}$  S $-25^{\circ}$  S $160^{\circ}-170^{\circ}$  W) for short periods (**a**) during Austral summer, 10-22 February 2003 (In Yellow: 9 February, in Magenta: 11-12 February, in Blue: 13-14 February, in Red : 16-17 February, in Green: 18-19 February, in Black: 21 February) and (**b**) during Austral winter, 9-15 June, 2003 (In Magenta: 9 June, in Blue: 11 June, in Red: 13 June, in Green: 15 June). The two aerial observations from Table 1 are added. Each pixel represents a surface of  $16 \text{ km}^2$  (the size of colored squares is equivalent to a surface of  $256 \text{ km}^2$ , i.e. 16 "real" SeaWifs pixels of  $4 \times 4$  km). Also shown are results obtained from Westberry et al. (2005) (black crosses) for the same time periods. In grey, the main lands of New Caledonia at  $20^{\circ}$  S, Vanuatu at  $15^{\circ}$  S and Fiji Islands at  $17^{\circ}$  S.

pixels, most of which corresponding to extremely high reflectance of New Caledonia or Fijian sandy lagoons that are later masked as shallow waters. Furthermore, only 15 points are identified as *Trichodesmium* by W05 and there is no indication of seasonal variation. Recall that the W05 algorithm was built to detect *Trichodesmium* at bloom concentrations (Chl-*a* threshold for a bloom was set to 0.8 mg m<sup>-3</sup>) while TRICHOSAT detection does not imply Chl-*a* concentration threshold. The rather weak spectral anomalies of *Trichodesmium* pixels may explain why W05 does not detect more blooms in the SP. The first published set of criteria for screening pixels containing *Trichodesmium* overemphasized



**Fig. 10.** Daily evolution of the TRICHOSAT retrievals shown as red bars (in % pixels, over the SP domain) from individual SeaWiFS Level2 GAC images, and number of surface slicks observed per month (Nb issued from Table 1) as black open circles in the SP area for the period 1998–2010.

backscattering (for  $\lambda > 500$  nm) and Colored Dissolved Organic Matter (CDOM) absorption (for  $\lambda < 440 \text{ nm}$ ) so that finally a refined model using subtle variations in reflectances between phytoplankton and Trichodesmium spectra had to be used (Westberry and Siegel, 2006). In the SP, Trichodesmium bloom signatures may not be strong enough to be detected by W05, or blooms occur in filaments whose signatures may not be strong enough to affect 16 km<sup>2</sup> pixels. Finally, living colonies of Trichodesmium are often associated with other phytoplankton as observed during the Diapalis 07 cruise (Tenório, 2006) and serve to create a mixed optical signal obfuscating detection. Trichodesmium biomass could then be well below the W05 detection threshold, and/or the other phytoplankton biomass would be higher in proportion in the SP than in the northern hemisphere. This may also explain why the W05 algorithm detects similar Trichodesmium pixel numbers in winter and in summer. Overall, TRICHOSAT was tuned to detect the Trichodesmium blooms that we have observed in the field in summer, and the W05 algorithm fails to detect these blooms.

#### 4.2 Optical validation of the algorithm

Ideally, one would validate the RAS of TRICHOSAT detected *Trichodesmium* pixels with in situ radiometric measurements made in *Trichodesmium* surface blooms. Unfortunately, such a task is difficult as there is no direct measurement of the RAS which would require accurate measurements of above in water reflectance. Past work has recognized this as problematic (Subramaniam et al., 1999; Kutzer, 2009). Recall that the *Trichodesmium* bloom RAS is defined by a very small range of S and Yt. This implies that SeaWiFS spectra are not so different from what they are expected at a given  $K_{490}$  (i.e. at a given Chl-*a* concentration) despite the fact that filamentous cyanobacteria blooms appear brighter than surrounding water areas due to high backscattering associated with gas vesicle and to a specific microbiotope (bacteria, detritus) (Subramaniam et al., 1999). One of the TRICHOSAT shape criterion is that the RAS must never show a bump at 555 nm. It is well known that reflectance spectra of colonies, assembled on filters (Dupouy et al., 2008) are characterized by a succession of troughs, each trough corresponding to different pigment absorption maxima (e.g., chlorophyll, phycourobilin and phycoerythrobilin). A trough around 550–560 nm related to phycoerythrin is systematically observed in collected *Trichodesmium* suspension (PSICAM absorption measurements, Dupouy and Röttgers, 2010; raw H6-backscattering spectra, Dupouy et al., 2008), and in situ samples during the 2004 bloom (unp. data).

The second robust criterion is that the RAS must never show a trough at 670 nm (rather a bump at 670 nm). It has been shown that high near-infrared reflectance is observed if colonies are accumulated on top of the water (Subramaniam et al., 1999; Dupouy et al., 2008). The RAS would then depend on the proportion of colonies lying above the water surface, its thickness, the physiological characteristics of colonies, and the age of the bloom (Dupouy et al., 1990, 1992, 2008). The high reflectance of blooms at 670 nm which was observed with the Coastal Zone Colour Scanner (CZCS) could provide an approach to detecting slicks from MODIS (Hu et al., 2010; McKinna et al., 2011) or IRS-P4 OCM (Sarangi et al., 2004).

There was no robust criteria for the RAS at 412 nm even though a significant RAS feature was expected at this wavelength as it has been shown that Dissolved Organic Carbon (DOC) and CDOM is released from dead or living colonies (Subramaniam et al., 1999). Optical characteristics of surrounding waters may also be important for defining RAS of *Trichodesmium* blooms. As seen in Fig. 7b, the dissolved matter + detritus absorption coefficient, ACDM (derived from the GSM optical inversion model at 443 nm; Maritorena et al, 2002) for the SP box experiences a strong seasonal variation due to the well documented annual cycle of solar bleaching and photolysis in the South Pacific (Siegel et al., 2002, 2005). *Trichodesmium* surface blooms correspond to the period of minimum CDOM concentration in summer. In the SP, some peaks are associated with a secondary CDOM maximum which could be produced by blooms (e.g., February 1999, 2003, 2004 and 2006). In contrast, the particulate backscattering coefficient,  $b_{bp}$  (also derived from Maritorena et al., 2002) was rather constant though noisy over the 12year period (Fig. 7b). *Trichodesmium* blooms correspond to the period of minimum backscattering, as a weak maximum appears in June–September (more or less in phase with chlorophyll concentration). The  $b_{bp}$  cycle in the SP could be linked to small-sized detritus as suggested by Loisel et al. (2006) rather than to *Trichodesmium* blooms.

The relatively strong response by TRICHOSAT in the northern Pacific around 160° W between 1998 and 1999 during boreal winter (November-December 1998 (yellow in Fig. 6); January-March 1999 (black in Fig. 6)) does not correspond to visual observations of blooms in this area (Dore et al., 2008). Further, from 2000 to 2010, no Trichodesmium pixels were retrieved during boreal winter in the Northern Pacific area by TRICHOSAT. We have no explanation for what happened during the 98-99 boreal winter period near Hawaii. We conclude that there is some signal there picked up by the TRICHOSAT algorithm. Blooms of unknown origin have been reported previously using CZCS observations in December (Dore et al., 2008). This has to be caused by floating living material similar in reflectance to Trichodesmium and therefore having the same SeaWiFS RAS. Also, there may be a different relationship between reflectance and K<sub>490</sub> in SeaWiFS data for these five months than for the rest of the studied period. Further research should be conducted to determine the nature of this optical signal in the Northern Pacific.

# 4.3 Relationships with phytoplankton in the water column

The austral summer maxima of surface blooms detected with TRICHOSAT in SP (Fig. 7a) correspond with the interannual variations of Trichodesmium abundances in the surface layer (2 m, Table 2). Lower Trichodesmium densities and slick observations were observed in situ in April-May 2002-2003 and October 2001-2003 (Tables 1 and 2) which also appear as lower surface bloom extent identified by TRI-CHOSAT. At the opposite, a surprisingly low Trichodesmium concentration (200–400 trichomes. $L^{-1}$ ) was observed in the water column in December 2001-January 2002 while the surface bloom extent by TRICHOSAT was high. In June-August 2003 (winter season), Trichodesmium was rare and total chlorophyll in the  $>10 \,\mu m$  fraction was less than 10 % (Table 2). Thus, the community was dominated by picoplankton (cyanobacteria and picoeucaryotes) and the surface bloom extent detected by TRICHOSAT was minimum.

The low percentage of detected surface blooms by TRI-CHOSAT, occurring in summer, corresponds to a physiological state where colonies become buoyant because they cannot synthesize ballast anymore due to phosphate limitation and thus float as dead material and accumulate at the surface (Moutin et al., 2005). Such conditions may be spatially and temporally de-coupled from actively growing *Trichodesmium* colonies in sub-bloom concentrations (observed from 0 to 60 m during Diapalis cruises). Applications of the algorithm for an estimate of potential nitrogen fixation would require a better understanding of the relationship between the development of *Trichodesmium* over the whole water column and surface accumulations.

Last, the relative abundance of Trichodesmium and other nitrogen-fixing cyanobacteria need to be determined. Coccoid cyanobacteria (Crocosphaera, Cyanothece) have been detected from their phycoerythrin signature (Neveux et al., 2006) and flow cytometric properties in the SP (Campbell et al., 2006; Moisander et al., 2010; Sato et al., 2010; Biegala, personal communication, 2010). Nitrogen-fixing heterotrophic bacteria have also been identified in the SP (Rieman et al., 2010). During summer, nitrogen fixation both from filamentous and coccoid cyanobacteria (Garcia et al., 2007; Hynes et al., 2009) exhibited high rates (151- $703\,\mu M\,N_2\,m^{-2}\,d^{-1})$  compared to those measured north of Papua-New Guinea (Bonnet et al., 2009). Late 2007 field observations confirmed the dominance of Trichodesmium in association with Crocosphaera in the South Pacific, spatially decoupled from unicellular picocyanobacteria (Hewson et al., 2009; Moisander et al., 2010; Sato et al., 2010). Crocosphaera, Cyanothece and picocyanobacteria populations may form a high fraction of total nitrogen fixation which will not be detected by TRICHOSAT.

Furthermore, better knowledge of the spatial and temporal association of coccoid cyanobacteria with *Trichodesmium* (Campbell et al., 2006; Sato et al., 2010; Moisander et al., 2010), would help in getting a global view of all nitrogen fixing organisms.

#### 5 Conclusions

The TRICHOSAT algorithm is efficient at discriminating Trichodesmium surface accumulations in the Western tropical Pacific Ocean. Its results can complement the identification of major functional groups provided by PHYSAT. TRICHOSAT was developed for the SP and is even able to follow the daily evolution of surface blooms over the whole 1998–2010 period (Fig. 10). Its application at a global scale requires that the RAS criteria in TRICHOSAT is representative of Trichodesmium blooms in other regions, and also that characteristics of surrounding waters resemble those in the SP. Reasons why detection of Trichodesmium with other algorithms was much less successful (100 times less pixels and no seasonality) in the Western Tropical Pacific Ocean may be, (1) low Trichodesmium concentrations, (2) a weak discriminating optical signal due to a mixed optical assemblage, and (3) a significantly different Trichodesmium optical signature in the SP than other areas.

Trichodesmium experienced large inter-annual variability in the region with maxima in 1999, 2003, 2004 and 2005, while 2001 and 2002 were less favourable. This inter-annual variability might be related to large scale circulation dynamics. For example, the bifurcation latitude of the South Equatorial Current is found to move southward from about 15°S near the surface to south of 22° S in the intermediate layers (Qu and Lindstrom, 2002) associated with large scale changes in the phosphate pool (Dyrhman et al., 2006; Tadokoro et al., 2009). Also, iron-rich dust deposition patterns (Gao et al., 2001) may be highly variable in time. Whether other phytoplankton blooms are triggered by Trichodesmium decomposition of organic matter is also of interest (Chen et al., 2008, 2011). Late summer chlorophyll blooms in the oligotrophic North Pacific subtropical gyre may be fuelled by Trichodesmium (Wilson and Qiu, 2008).

TRICHOSAT demonstrated that *Trichodesmium* blooms are a common feature in the SP during austral summer (October to March). They are temporally and spatially linked to diverse nitrogen-fixing populations and can be identified as a major potential carbon sink in the SP. A large-scale physical and biogeochemical modeling of the distribution of *Trichodesmium* is required in the SP.

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