

# Numerical simulations of SAR microwave imaging of the Brazil current surface front

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# ABSTRACT

This paper analyzes the hydrodynamic and atmospheric instability modulation mechanisms which influence the Brazilian Current's (BC) thermal front signature in Synthetic Aperture Radar (SAR) images. Simulations were made using the M4S SAR imaging model. Two SAR images of the Brazilian Southeastern Coast depicting the BC's thermal front were selected including a VV (ASAR/Envisat) and a HH polarization (RADARSAT-1) image. Conditions of current shear and divergence were reproduced for the fronts imaged, using in situ (Acoustic Doppler Current Profilers) current velocities. Wind velocity fields were simulated based on QuikSCAT data. Results showed that SAR imaging of the BC front may be influenced both by atmospheric instabilities hydrodynamic modulations. mechanism prevailed on the RADARSAT image and the latter on the ASAR/Envisat image. When atmospheric instabilities prevailed, the contribution of shear and divergence was almost negligible. When hydrodynamic modulations prevailed, a better agreement between the simulated responses and SAR image responses was obtained by inforcing a reduction of 88% in the relaxation rate, and higher divergence values, of the order of 10<sup>-4</sup> s<sup>-1</sup>. Results indicate that, for some specific cases, local increases in shear and divergence may allow the detection of the BC thermal front.

**Descriptors:** Brazil Current front; Synthetic Aperture Radars; SAR imaging model.

# RESUMO

Esse artigo analisa os mecanismos, modulação hidrodinâmica e instabilidade atmosférica que permitem a visualização da frente térmica da Corrente do Brasil (CB) em imagens Radar de Abertura Sintética (SAR). Simulações numéricas realizadas com o modelo M4S basearam-se em duas imagens SAR da costa sudeste brasileira, nas polarizações VV (ASAR/Envisat) e HH (RADARSAT-1), mostrando a região frontal da CB. A simulação das condições médias de cisalhamento e divergência da região frontal se baseou em dados in situ (Acoustic Doppler Current Profilers) de correntes superficiais. Os campos de ventos foram simulados a partir de dados do escaterômetro QuikScat. Os resultados mostram que ambas as modulações por instabilidade atmosférica e hidrodinâmica influenciaram a visualização da frente da CB. O primeiro mecanismo foi dominante na reprodução da modulação da imagem RADARSAT, enquanto o segundo gerou padrão próximo à imagem ASAR/Envisat. No caso de dominância da instabilidade atmosférica, a influência da modulação hidrodinâmica foi pequena. Na prevalência de modulação hidrodinâmica, observou-se boa concordância entre os resultados simulados e reais, porém utilizando valores de divergência da ordem de 10<sup>-4</sup> s<sup>-1</sup> e impondo uma diminuição de 88% na taxa de relaxação. Os resultados indicam que, em casos específicos, o aumento da divergência/cisalhamento na região frontal poderia possibilitar a visualização da frente térmica da CB.

Descritores: Frente da Corrente do Brasil, Radar de Abertura Sintética, Modelo de imageamento SAR.

# INTRODUCTION

Ocean fronts are important oceanographic features related to which a wide array of physicochemical processes may be observed. Fronts are frequently zones of enhanced convergence and mixing where local hydrodynamics favor particle retention, while enrichment mechanisms allow the development of stable plankton communities (BAKUN, 2006). A spatial-temporal persistence of such primary production hotspots may, eventually, sustain important fishing stocks. Studies of ocean fronts also contribute to a better understanding of atmosphere-ocean interactions and ocean mesoscale variability (JOHANNESSEN et al., 2005).

Remote sensing can provide synoptic, high temporal coverage and high spatial resolution data of the ocean surface, aspects that stand as important elements for the study of ocean fronts. Sea Surface Temperature (SST) fields, obtained by thermal infrared radiometers, are often used to detect and map thermal fronts, while Chlorophyll-α fields may be used to detect local hydrodynamic retention and enrichment processes. Several studies using SST fields have recently been undertaken to characterize the variability of the Brazil Current (BC) surface front (SILVEIRA et al., 2008; LORENZZETTI et al., 2009).

As a limitation, both infrared and ocean color radiometers are passive sensors which depend on the emitted infrared or the reflection of sunlight radiation, and are strongly influenced by the concentration of water vapor in the atmosphere and the presence of clouds. In the case of ocean color sensors, imaging which is primarily done on the visible wavelength band is further limited to daylight time acquisitions. The detection of fronts using SST fields may also be hampered when a homogeneous thermal layer is developed above the frontal zone, concealing thermal contrasts. Though SST products from microwave radiometers are little influenced by clouds and water vapor, their uses are still limited by coarse spatial resolutions, of scales of several kilometers, which often prevent a proper visualization of thermal fronts (LORENZZETTI et al., 2008). Despite such limitations, these products may still be employed in ocean front studies as complementary data.

Active remote sensing systems such as Scatterometers and Synthetic Aperture Radars (SAR) are capable of measuring changes in ocean surface roughness based on backscattering patterns, caused by Bragg waves (high frequency gravity-capillary resonant waves of the order of the radar's wavelength), specular reflection and

wave breaking. The relative influences of each of these mechanisms vary with radar wave frequency, polarization and incidence angle (KUDRYAVTSEV et al., 2005). SAR sensors have been successfully employed in the detection of ocean fronts; frontal regions can be detected by SAR systems due to the changes in surface ocean roughness existing in these regions. SAR images have advantages over scatterometer data, as their high spatial resolution allows the representation of fine scales (of the order of a few to tens of meters), which are more appropriate to detect ocean fronts. There are three mechanisms that can be assumed to be responsible for most of the changes in ocean surface roughness in frontal zones and that strongly influence the visualization of these features in SAR images (LYZENGA et al., 2004):

- a) Interaction between surface waves and the surface current gradients, a mechanism also called hydrodynamic modulation. Changes in ocean surface roughness caused by the interaction between surface waves and strong gradients of current velocity fields normally found in frontal zones often lead to significant changes in the amount of backscattered radar energy. In regions of strong surface current convergences the Bragg wave energy is increased, enhancing radar backscattering, while in divergence zones, Bragg wave energy is decreased, leading to a reduction of the backscattered signal.
- b) Concentration of surfactants in convergence zones. Convergence and divergence of surface currents influence the horizontal redistribution and vertical accumulation of surfactants at the sea's surface. Conditions of current convergence favor the development of surfactant accumulations. Surfactants tend to reduce radar backscattering (ROBINSON, 2004). In SAR images, the accumulation of surfactants is often represented by dark lines.
- c) Instabilities of the atmospheric boundary layer (ABL), also known as ABL instability modulation. Significant changes in the SST field, associated with the presence of thermal fronts, can influence ocean-atmosphere heat exchanges. The ABL tends to be more stable on the cooler sides of the thermal fronts and the ABL is normally unstable and deeper in the warm sector of the front (CHELTON et al., 2004). These variations in ABL stability near the sea surface induce changes of the surface wind and stress as well as latent and sensible heat fluxes (SMALL et al., 2008). Wind stress is the key variable controlling the short wind wave spectrum (Bragg spectrum) and consequently the Normalized Radar Cross Section NRCS (KUDRYAVTSEV, 1996). These changes in the NRCS

on the two sides of the frontal zones are often significant enough to make them visible as interfaces separating the cold and the warm sides of the oceanic thermal front: cold SSTs are represented as darker areas, while brighter areas represent warmer SSTs (ROBINSON, 2004).

Few studies have used SAR images to investigate oceanographic features on the Brazilian Coast, especially for the detection of Brazil Current (BC) features such as eddies, meanders and fronts. RADARSAT-1 data (C-band) have been tested for the detection of the BC frontal zone in the Campos Basin on the southeastern coast of Brazil (LORENZZETTI et al., 2008). Despite some limitations, authors acknowledge the potential of those images as a complementary tool, along with SST imaging, for the detection of the BC front, emphasizing the real advantages under the presence of extensive cloud cover. Nonetheless, their results also show cases in which the CB front was clearly viewed in SST images but did not appear in near simultaneous SAR images.

It must be highlighted that the study of mesoscale features by SAR imaging may not be an easy task, even in the simplest cases. Such difficulties arise from the complex interactions between the physical processes influencing the patterns of surface signatures in SAR images, along with a generalized lack of *in situ* data matching SAR acquisitions in space and time. Ideally, *in situ* data should include surface wind speeds and directions, as well as a proper characterization of the ABL, along with other useful information such as the presence of surfactants (JOHANNESSEN et al., 2005).

Recent advances in the mathematical representations of the physical interactions between the electromagnetic radiation and the ocean surface also contemplate their representation in SAR images. These efforts have led to the development of mathematical numerical models that allow the simulation of SAR images. Direct models for SAR imaging simulation provide an alternative method for the study of the dynamics of mesoscale feature signatures in SAR images (JOHANNESSEN et al., 2005). The term "direct modelling" refers to a set of algebraic equations that provide estimates of the NRCS - a parameter that controls the brightness of SAR image pixels - in images of the ocean surface based on a series of sensor (frequency, polarization, incidence angles) and environmental (surface wind fields, wave spectra, surface currents and other) parameters.

Regarding the direct models, some publications address their development (ALPERS; HENNINGS, 1984;

ROMEISER; ALPERS,1997; ROMEISER et al., 1997; KUDRYAVTSEV et al., 2003a; KUDRYAVTSEV et al., 2003b and KUDRYAVTSEV et al., 2005) and others their use for SAR imaging simulations to study the dynamics of ocean surface features and their effects on SAR signatures (BRANDT et al., 1999; UFERMANN; ROMEISER et al., 2004; JOHANNESSEN et al., 2005). Recent models, such as the M4S and the Radar Imaging Model (RIM) are now able to provide very realistic simulation results. The present study employed the M4S model developed by ROMEISER and ALPERS (1997) ROMEISER et al. (1997), ROMEISER and THOMPSON (2000). This model is mostly based on the Bragg backscattering mechanism and the Weak Interaction theories (LONGUET-HIGGINS; STEWART, 1964; WHITHAM, 1965; BRETHERTON, 1971); it is also able to represent the geometric modulations caused by the tilt of illuminated facets and range variations, the hydrodynamic modulation of Bragg waves caused by longer waves, and it also includes the "velocity bunching" mechanism (ROMEISER et al., 1997). Details of the RIM model may be found in KUDRYAVTSEV et al. (2003a; 2003b; 2005), and in JOHANNESSEN et al. (2005). The RIM model also accounts for the modulation caused by surfactant accumulations and wave breaking at the frontal zone.

The objective of this study was to study the mechanisms influencing the surface signatures of the BC front in the Campos Basin Region in SAR images. For that we conducted simulations using the M4S model, aiming to achieve a better understanding of the relative roles of environmental mechanisms (hydrodynamic modulation and ABL instabilities) in modulating the NRCS in the frontal zone.

# MATERIAL AND METHODS

STUDY AREA

The Campos Basin (Figure 1) is located on the Southeastern Brazilian Coast, between zonal limits of 20°S and 25°S. The region extends for 100,000 km² and encompasses a continental shelf width of 100 km. Shelf break depths vary from 80 m in its northern portion to 130 m in its southern portion. The continental slope extends offshore for 40 km, with a mean declivity of 2° (VIANA et al., 1998).

Along the Campos Basin coastal sector, the Brazil Current (BC) is characterized by intense mesoscale activity, with a strong meandering and frequent eddy

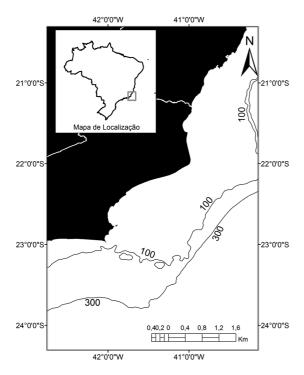


Figure 1. Map of the study area.

shedding between Cabo Frio and Cabo de São Tomé. SILVEIRA et al. (2004, 2008) associated the development of meanders and eddies to baroclinic instabilities caused by the intense vertical shear created by the contact between the southward surface flow of the BC and the interior northward flow of the Intermediate Contour Current (ICC) at depths of 500m.

#### MATERIAL

Two SAR images of the Campos Basin Region (Figures 2 and 3), containing ocean front signatures, were selected. Images were acquired by the RADARSAT-1 and ASAR/Envisat sensors (Table 1), operating at a 5.3 GHz frequency (C Band). The RADARSAT-1 image (HH polarization) was acquired in the ScanSAR Narrow mode (300 km) at a spatial resolution of 50 m (25 m of pixel size in range and azimuth). The ASAR/Envisat image (VV polarization) was acquired in Wide-swath mode (400 km), at a spatial resolution of 150 m (75 m of pixel size in range and azimuth). Image selection also considered the availability of wind measurements for both acquisitions. In order to detect the thermal boundaries of the BC front, we employed SST data from the Multiscale Ultrahigh Resolution (MUR) Product, developed by the Group for High Resolution Sea Surface Temperature (GHRSST). The MUR Product results

from a reanalysis (Level 4) of SST data acquired from both thermal and microwave radiometers (AQUA/AMSR-E, AQUA/MODIS, NOAA-18/AVHRR-3, TERRA/MODIS, CORIOLIS/WINDSAT) along with *in situ* observations (CHIN et al., 2013).

Both radar images were radiometrically calibrated (absolute calibration), providing comparable standardized values of the ocean surface radar signal backscattering. The original digital values for each pixel were converted into calibrated NRCS values. The ASAR/Envisat image calibration was conducted on Next ESA SAR Toolbox (NEST), using the algorithm proposed by ROSICH and MEADOWS (2004). The RADARSAT-1 image calibration was performed by the *PCI Geomatica* 2013 software, using the RADARSAT INTERNATIONAL (2004) method.

Wind data consisted of daily products (level 2B) acquired by the SeaWinds scatterometer flying onboard the QuikSCAT satellite which was developed to provide oceanic wind speed and direction estimates, based on measurements of Bragg wave backscattering. The QuikSCAT satellite ended its operations in November 2009. The scatterometer wind fields employed here were reprocessed at NASA using the scatterometer geophysical model (v.3) developed by FORE et al. (2014). Wind speeds are assumed at 10 m height and under a condition of neutral atmospheric stratification. QuikSCAT wind velocities were available on a 12.5 km pixel grid, at a spatial resolution of 25 km. As stated above, acquisition dates were chosen in order to coincide as far as possible with SAR acquisitions.

Values of divergence and shear of surface currents on the BC front were calculated from in situ current measurements acquired on a series of oceanographic cruises (Comissões Oceano Sudeste - OCSE- II, IV e V; Table 2) conducted by the Brazilian Navy in the study area. Profiles of current velocity and direction were obtained by Acoustic Doppler Current Profilers (ADCP) in different periods of the year. All data were processed at the Physical Oceanography Department of the Oceanographic Institute of the University of São Paulo (Instituto Oceanográfico/ Universidade de São Paulo - IO/USP), using the Common Ocean Data Access System (CODAS) protocol, developed by the Hawaii University. Current velocities were available at a mean spatial resolution of 5.3 km. These data are organized and may be found in the archives of the National Oceanographic Data Base (Banco Nacional de Dados Oceanográficos - BNDO) maintained by the Brazilian Navy.

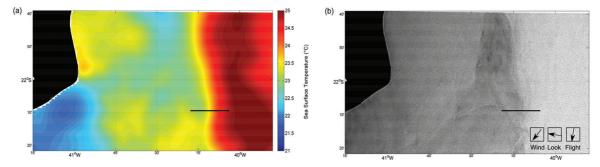


Figure 2. a) MUR SST field acquired in the same date as the SAR acquisition. The black line represents the same transect depicted in the RADARSAT-1 image. b) RADARSAT-1 image acquired in November 21, 2005 (12:26 UTC). The black line represents a transect crossing the front, from where NRCS values were retrieved and compared to the simulated results. Lower NRCS values can be observed in the onshore sector of the black transect.

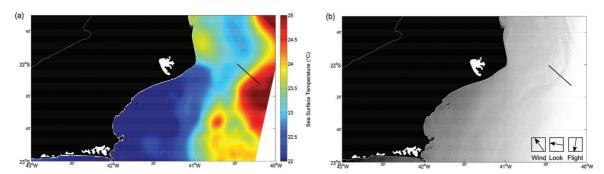


Figure 3. a) MUR SST field acquired in the same date as the SAR acquisition. The black line represents the same transect depicted in the ASAR/Envisat image. b) ASAR/Envisat image acquired in October 15, 2009 (12:32 UTC). The black line represents a transect crossing the front, from where NRCS values were retrieved and compared to the simulated results. Lower NRCS values delimit the center of the front.

Table 1. Acquisition information for the RADARSAT-1 and SAR/Envisat images analyzed.

Image number	Platform	Date	Acquisition time (UTC)	Central Latitude	Central Longitude	Orbit
1	RADARSAT-1	21/11/2005	12:26:02	-22.215°	-40.633	Descending
2	ASAR/Envisat	15/10/2009	12:32:06	-22.542°	-42.250°	Descending

**Table 2.** Summary of dates and seasons of ADCP data acquisitions (OCSE - *Comissões Oceanográficas Sudeste* II; IV and V).

Cruise	Dates	Seasons	
OCSE-II	22/10/2002 to 03/12/2002	Spring	
OCSE-IV	28/01/2006 to 13/04/2006	Summer/Autumn	
OCSE-V	07/06/2010 to 07/07/2010	Winter	

# **METHODS**

Shear and divergence of surface currents at the BC front

Calculations of shear and divergence were based on the data acquired by the ADCP profiles sampled on the survey transects that covered the frontal zones depicted in both SAR images, between the localities of Arraial do Cabo and Cabo de São Tomé (Figure 1). One single transect crossing

the frontal zones was selected on each oceanographic cruise (Comissões OCSE II; IV and V). Calculations were made for the 20 m depth acoustic data, in which the influence of spurious surface noise would be minimal.

Considering a horizontal plane x-y with the velocity component u(v) in direction x(y), current shear  $(\tau)$  and divergence (Div) were calculated as indicated in equations (1) and (2), respectively.

$$\tau = \frac{\partial v}{\partial x} - \frac{\partial u}{\partial y} \tag{1}$$

$$Div = \frac{\partial u}{\partial x} + \frac{\partial v}{\partial y} \tag{2}$$

In this study, directions x and y were chosen with reference to the orientation of the thermal front. The x-direction is chosen as normal to the front, and consequently the y-direction runs parallel to the front. Since the sampling transects used in the analysis were always orthogonal to the thermal front orientation, the second terms of Equations 1 and 2 were neglected during shear and divergence calculations.

Maximum values for shear and divergence obtained from available *in situ* data were selected and averaged for each transect, on each survey cruise. Mean shear/divergence maxima were treated here as the typical values of shear and divergence found in the BC frontal zone. We found typical values of divergence of  $\pm 3 \times 10^{-5}$  s<sup>-1</sup>, while typical shear was -4 × 10<sup>-5</sup> s<sup>-1</sup>. Such values were, then, employed as inputs in the M4S simulations in the following stages of this study.

# M4S - The Numerical Model to simulate SAR microwave ocean imaging

In order to simulate SAR images representing the BC ocean fronts, we employed the M4S ocean surface microwave interaction model. The theoretical basis of the M4S model is presented in ROMEISER et al. (1997), ROMEISER and ALPERS (1997), and ROMEISER and THOMPSON (2000). The M4S model employs a set of numerical routines that simulate microwave radar imaging of ocean surface features that may be either associated with or modulated by a surface current field, as well as by variations of the ocean surface wind field. The inherent variability of current and wind fields through the hydrodynamic and aerodynamic modulation mechanisms can modulate the surface wave spectrum and modify the NRCS values observed in SAR images. The M4S model can be used to simulate SAR images of the ocean surface acquired on different frequency bands, polarizations and incidence angles. The model's applicability is for incidence angles between 20° and 70° (Bragg wave range).

Simulations with the M4S model require two mandatory input files containing the velocity fields for surface currents and 10 m height winds. While ocean bathymetry and NRCS values in the continent or island regions may also be used, our simulations were processed using only the mandatory inputs files. The M4S first module (M4Sw320) calculates a spatially varying wave height spectrum based on the surface current and wind velocity fields. For this stage, we employed the wave height spectrum model developed by ELFOUHAILY

et al. (1997), along with the Limited Quadratic Source Function developed by WENSINK et al. (1999). The Limited Quadratic Source Function was chosen in order to limit the wave height decay in zones under low wind speeds. Wave breaking effects were not considered, as the proper parameterizations are still under development in the M4S model. The simulations were configured by input files so that the second module (M4Sr320) used the wave spectrum produced by the M4Sw320 module, along with sensor (frequency, polarization, platform altitude and velocity) and imaging (incidence angle, look direction, and platform heading) attributes, to compute NRSC matrices. This module, also known as the Radar Module, also incorporates the contributions from the Improved Composite Surface Model (ROMEISER & ALPERS, 1997; ROMEISER et al., 1997; ROMEISER; THOMPSON, 2000), as well as from artifacts generated by the imaging mechanism. The M4S modelling procedures are summarized in Figure 4.

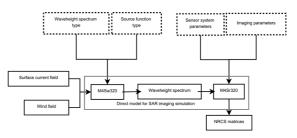


Figure 4. Flux diagram depicting the M4S modelling scheme.

# SAR MICROWAVE SIMULATIONS AT THE BC FRONT

The influence of the hydrodynamic modulation mechanism on NRCS values at the BC frontal zone was evaluated through a series of customized simulation experiments with the M4S model. The first objective of these experiments was to evaluate the response of the NRCS values to variations in surface current shear in the frontal zone. As a second objective, we evaluated the model response to surface current divergence/convergence, which are common features in ocean fronts.

To generate the surface current velocity field files needed as M4S model inputs we constructed synthetic current fields using the typical values of shear and divergence derived from *in situ* ADCP data. To obtain the needed shear and divergence values, the current field was parameterized as in the formula below, in which the surface current gradients are decomposed into two components, one normal and one parallel to the thermal front (ASKARI et al., 1997).

$$(u_x, u_y) = u_0 + \left[ \frac{\delta u}{2} \tanh \left( \frac{x - x_c}{\delta x_c} \right) \right]$$
 (3)

Where  $u_x$  and  $u_y$  represent the current velocity components normal and parallel to the ocean front, respectively. The terms  $u_0$  and  $\delta u$  are constants representing, respectively, the mean and the variations on current velocity;  $x_c$  represents the location of the front along the x axis and  $\delta x_c$  is the spatial extension (m) where current velocity variations occur.

In order to better understand the effects of hydrodynamic modulation, three different experiments were conducted. The first experiment considered only the effects caused by current shear. The second and third experiments considered the effects caused by current shear and divergence, changing the magnitude of the divergence. These experiments were done twice; one group for Radarsat-1 and the other for Envisat SAR images. All simulations were structured so as to reproduce the environmental characteristics and imaging patterns on both SAR images.

All simulations assumed a typical shear value of  $-4 \times 10^{-5} \, s^{-1}$ . The behavior of the NRCS values at the BC frontal zone was significantly different on the two SAR images. For the RADARSAT-1 image (Image 1) (Figure 2) they change from a lower value at the shelf to a higher value across the front and at BC. In the ASAR/ENVISAT image (Image 2) (Figure 3), the NRCS values show a negative anomaly at the frontal region. For the second type experiments, we assumed negative divergence (convergence) values of  $-3 \times 10^{-5} \, s^{-1}$  for Image 1, and a positive value of  $3 \times 10^{-5} \, s^{-1}$  for Image 2.

It must be noted that the divergence values used here had magnitudes of the order of  $10^{-5}$   $s^{-1}$ . Similar studies of frontal zones (UFERMANN; ROMEISER, 1999; KUDRYAVTSEV et al., 2005) have often assumed mean divergences of higher magnitudes ( $10^{-4}$   $s^{-1}$ ). Considering that our estimates of shear and divergence were based on *in situ* measurements on dates differing from our SAR acquisitions and that the spatial resolution of the ADCP data available could be underestimating the real current changes at the front, we decided to conduct a third type of experiment, in which mean divergence was increased by one order of magnitude. Therefore, we assumed a negative divergence of  $-1 \times 10^{-4}$   $s^{-1}$  for Image 1, while assuming a positive divergence of  $1 \times 10^{-4}$   $s^{-1}$  for Image 2.

Table 3 presents a summary of the parameters employed in each experiment. Following LORENZZETTI et al. (2009), a spatial extension of  $5 \times 10^3$  m was assumed as the BC front width where velocity variations occurred.

The center of the front differed for each image: for the RADARSAT-1 image, 12,500 m, while for the ASAR/ENVISAT image, 18,500 m. The origin of the x-axis is at the left end of each transect. An incidence angle of 24.8° was calculated for the BC front depicted by Image 1. A lower value, of 18.9°, was present at the front depicted by Image 2. Considering that the M4S model only accepts incidence angles of more than 20°, all of our simulations assumed fixed angles of 20° for image 2.

**Table 3.** Parameters of mathematical relationships proposed by Askari et al. (1997) used to obtain the chosen shear and divergence for each experiment.

		$u_{0x}$	$u_{0y}$	$\delta u_{_{x}}$	$\delta u_{_{y}}$
Experiment 1	Image 1	0.0	-0.4	0.0	-0.2
Experiment 1	Image 2	0.0	-0.4	0.0	-0.2
E	Image 1	-0.225	-0.4	-0.15	-0.2
Experiment2	Image 2	0.225	-0.4	0.15	-0.2
Г :	Image 1	-0.35	-0.4	-0.5	-0.2
Experiment 3	Image 2	0.35	-0.4	0.5	-0.2

All experiments designed for studying the shear and divergence effects were carried out using constant and homogeneous synthetic wind fields. As the main objective of the experiments was to evaluate the effects of hydrodynamic modulation over the SAR signatures of the BC ocean front, the use of homogeneous wind fields was necessary in order to reduce the influence of wind speed variability on the results. Mean wind speeds (Umean) were determined using SeaWinds scatterometer data as close as possible to the SAR imaging times. Maximum time difference was 7 hours for image 1. An information summary of the wind parameters used to build the synthetic wind fields is presented in Table 4. Figures 5 and 6 represent the synthetic wind and current fields used as inputs in the Experiments related to Images 1 and 2, respectively. Graphics depict the variations in current (left) and wind (right) velocities along a transect normal to the BC front.

A second sequence of Experiments was done to evaluate the effects of ABL instabilities on the NRCS modulation and how they might affect the visualization of the BC thermal front on SAR images. At this stage, simulations were based only on Image 1, as it depicted the step-like increase of the NRCS values at the frontal zone. This pattern is consistent with earlier descriptions of the NRCS behavior in thermal fronts that were subject to ABL instabilities (UFERMANN; ROMEISER, 1999; KUDRYAVTSEV et al., 2005).

**Table 4.** Information summary for the Wind data used to build the synthetic Wind fields used in the experiments. Mean wind speeds ( $U_{mean}$ ) were retrieved from wind velocity fields acquired by SeaWinds near the SAR imaging times. Wind directions assume a clockwise direction from a geographic north ( $\alpha$ ), and a counterclockwise direction from the x axis ( $\beta$ ), normal to the front axis.  $\phi$  wind directions consider the wind origin, assuming a counterclockwise direction, in relation to the radar beam (look direction).  $U_x$  and  $U_y$  represent the speed components perpendicular and parallel to the BC front, respectively.

Image	a (°)	<b>ß</b> (°)	<b>Ф</b> (°)	$U_{mean} \ (ms^{-1})$	$U_x \ (ms^{-1})$	$U_{y} \pmod{ms^{-1}}$
1*	148	124	131	5.84	-3.26	4.84
2**	39	273	240	7.42	0.39	-7.41

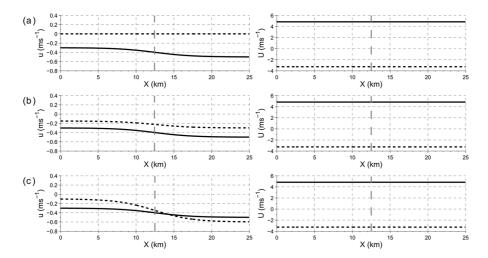
<sup>\*</sup> RADARSAT; \*\* Envisat.

Over warmer waters, ABL instability and surface wind increases through enhanced vertical mixing; over colder waters, wind stress and surface winds decrease in association with increased stability. Changes in wind stress are mostly attributable to SST-induced changes in wind speed (CHELTON; XIE, 2010). In the M4S model the neutral stability wind speed at 10 m height ( $U_{10}$ ) is the only parameter which represents the effect of the wind field on the ocean wave spectrum. The effect of variations of atmospheric stability is normally represented by variation

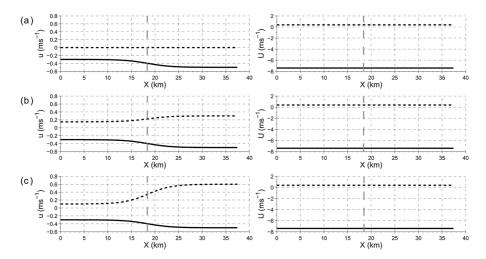
of the friction velocity or the drag coefficient. Since the variations of the drag coefficient are not accounted for in the model, only variations in the wind speed on the two sides of the front can be used under the assumption of a constant drag coefficient (UFERMANN; ROMEISER, 1999). Thus, the second group of experiments, specifically designed for studying the ABL instability change in the frontal zone, employed spatially varying synthetic wind fields. Variations of wind speeds were represented using the methodology used by UFERMANN and ROMEISER (1999). This method calculates wind speeds at frontal zones using a series of M4S simulations, and evaluating the increasing trends observed in the NRCS fields.

Variations on the NRCS across the front depicted in Image 1 were calculated by selecting 11 transects orthogonal to the ocean front. In order to reduce the effects from speckle noise - an intrinsic high frequency noise present in SAR images- a single typical transect was created by calculating the medians from the 11 transects at each point of it. This median transect was further averaged using a five pixel window filter.

The normal decay in the NRCS values, caused by the increase of the incidence angles of the SAR pulses from near to far range in the image, was removed from the resulting transect by a least square fitting of a straight line

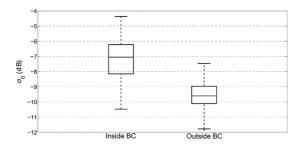


**Figure 5.** Representations of the synthetic fields used as inputs in the Experiments related to Image 1: variations of surface current (left) and wind (right) velocities represented along a transect crossing the BC front. Vertical gray lines mark the center of the front (xc): the areas at the left side represent the continental shelf region, while the right side is associated to the BC area. a) Experiment 1: surface current fields assuming a shear of  $-4 \times 10^{-5} \, s^{-1}$ , and an homogeneous wind field; b) Experiment 2: current fields assuming divergence of  $-3 \times 10^{-5} \, s^{-1}$ , and a shear of  $-4 \times 10^{-5} \, s^{-1}$ , with a homogeneous wind field; c) Experiment 3: current fields assuming a divergence of  $-1 \times 10^{-4} \, s^{-1}$  and a shear of  $-4 \times 10^{-5} \, s^{-1}$ , with an homogeneous wind field. Dashed black lines represent the velocity components normal to the front; solid black lines represent the velocity components parallel to the front.



**Figure 6.** Same as Figure 5, considering the experiments related to Image 2. a) Experiment 1: surface current fields assuming a shear of  $-4 \times 10^{-5}$   $s^{-1}$ , and an homogeneous wind field; b) Experiment 2: current fields assuming divergence of  $3 \times 10^{-5}$   $s^{-1}$ , and a shear of  $-4 \times 10^{-5}$   $s^{-1}$ , with an homogeneous wind field; c) Experiment 3: current fields with a divergence of  $1 \times 10^{-4}$   $s^{-1}$  and a shear of  $-4 \times 10^{-5}$   $s^{-1}$ , with an homogeneous wind field. Dashed black lines represent the velocity components normal to the front; solid black lines represent the velocity components parallel to the front.

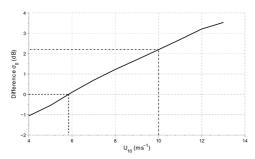
through the transect values. The NRCS values were, in the sequence, separated according to their position in relation to the BC front, generating two groups of pixels: inside pixels are located offshore of the front and outside ones onshore (towards the coast). Both groups of values are well distinguishable, as depicted in Figure 7, attesting the presence of aerodynamic modulation. The mean NRCS was of -9.5 dB for outside values, and of -7.3 dB for inside values, yielding a mean difference of 2.2 dB. For the Gulf Current front, UFERMANN and ROMEISER (1999) found a smaller difference, of 1.4 dB, using SIR-C/X-SAR images (C band; 5.3 GHz) with VV polarizations.



**Figure 7.** Box plot comparing the NRCS values at the inside (offshore) zones and outside (onshore) zones of the front. NRCS are plotted in dB (10\*log<sub>10</sub> NCRCS) scale. The horizontal line inside the boxes represent the median value.

The mean difference of 2.2 dB observed in the frontal region was converted into wind speed variation, using M4S simulations. In order to obtain a reference profile representing the increase of NRCS values with wind speed, a series of 10 different M4S simulations were conducted, using 10 homogeneous wind fields of different speeds and a null current field. Wind fields with increasing speeds, from  $4 \text{ ms}^{-1}$  to  $13 \text{ ms}^{-1}$ , at increments of  $1 \text{ ms}^{-1}$  for each new simulation were used. All simulations considered the imaging attributes of Image 1, such as: same polarization, mean incidence angle, azimuthal angle between wind direction and orientation of the front, as well as satellite sensor specifics.

Taking the mean wind speed of the study area from QuikSCAT data (5.84  $ms^{-1}$ ) as reference, which corresponded to a NRCS of -12.21 dB, we plotted the NRCS differences from it for each simulation as a function of used wind speed (Figure 8). Thus, the zero value on the y axis corresponds to a simulated NRSC associated with the mean wind speed of 5.84  $ms^{-1}$ . Regarding the graphic analysis, an increment of 2.2 dB across the front, as observed in the RADARSAT-1 image, would indicate an increase of 4.16  $ms^{-1}$  in wind speeds (from 5.84  $ms^{-1}$  to 10.0  $ms^{-1}$ ), assuming ABL neutral stability.



**Figure 8.** Difference between simulated NRCS values obtained by the M4S under varying homogeneous winds and that of the Reference profile *versus* wind speed. The black dashed line represents the NRCS value for the mean wind intensity at the study area (5.84 *ms*<sup>-1</sup>); the dash-dot line represents the wind intensity estimate when considering the increase in the NRCS at the BC front.

The spatially varying synthetic wind fields were then parameterized using the same method used in the parameterization of the surface current fields. Wind gradients were also decomposed into normal  $(U_x)$  and parallel (U) components (assuming the front as reference).

$$\left(U_{x},U_{y}\right)=U_{0}+\left[\frac{\delta U}{2}\tanh\left(\frac{x-x_{w}}{\delta x_{w}}\right)\right] \tag{4}$$

Where the constants  $U_0$  and  $\delta U$  represent the mean wind speed and its variation at 10 m height, assuming a neutral atmospheric stratification.  $x_w$  is the location of the wind front along the x axis, while  $\delta x_w$  is the width (m) along which wind velocity changes occur.

An angle of  $124^{\circ}$  was assumed between the wind direction and the x axis (See  $\beta$  value in Table 4). Hence, the normal component  $U_x$  varied from -3.26  $ms^{-1}$  to -5.59  $ms^{-1}$ , while the parallel component varied from 4.84  $ms^{-1}$  to 8.29  $ms^{-1}$ . In such cases, we adopted mean wind speed components of  $U_{0x} = 4.43 \ ms^{-1}$  and  $U_{0y} = 6.57 \ ms^{-1}$ , while the variations in wind components were of -2.33  $ms^{-1}$  and 3.45  $ms^{-1}$ . A width of  $5 \times 10^3$  m was defined. Front locations were centered at 12,500 m in the RADARSAT-1 Image. These simulations employed null current fields in order to reduce the influence of current variability, since the main objective of the experiments was to evaluate the effects of aerodynamic modulation over the SAR signatures of the BC ocean front.

The experiments carried out in the sequence also incorporated the effects from shear and divergence, by using parameterized current fields, as had been done previously for the hydrodynamic modulation experiments. In the first experiment for variable winds, we added a negative divergence of  $-3 \times 10^{-5} s^{-1}$ , and a shear of  $-4 \times 10^{-5} s^{-1}$ .

In the second experiment, divergence was increased by one order of magnitude ( $-1 \times 10^{-4} \ s^{-1}$ ), while shear remained the same as in the previous experiment. Representations of the wind and current fields used as inputs on the ABL instability Experiments are summarized by the graphics of Figure 9.

All Experiments described in this section were repeated, now using a modified relaxation rate, obtained by multiplying the original magnitude by a factor of 0.12. Such a procedure was suggested by BRANDT et al. (1999) in order to obtain better signal modulations to simulate the effects of solitary waves in SAR images.

# **ANALYSIS OF RESULTS**

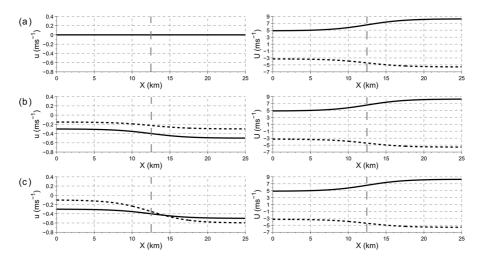
Results were evaluated and interpreted based on a quantification of the NRCS modulations for both real (SAR Images) and simulated (Experiments) frontal zones. As before, calculations were based on 11 transects perpendicular to the thermal front, from which real NRCS values were retrieved. Transect sizes differed for RADARSAT (12.5 km) and ASAR/ENVISAT (37.5 km) images due to their different pixel size (spatial resolution). To reduce the speckle noise present on each transect, a median NRCS from the 11 transects was calculated which was then filtered using a 5 pixel window. As a final step, we removed the decaying effect related to variations on the radar incidence angles. The speckle noise reduction process was only applied to real images. Finally, the linear NRCS modulation was transformed into a dB scale, using

$$\sigma_{0Rel} = 10 \log(\sigma_{0i}/\sigma_{0mean}) \tag{5}$$

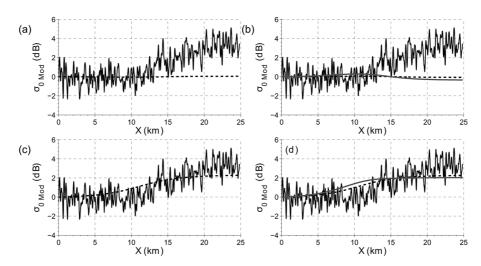
Where  $\sigma_{0i}$  is the NRCS value at each point (*i*) of the transect, and  $\sigma_{0mean}$  is the mean NRCS at the outside sector of the front (in this case the outer shelf region of the continental shelf).

# RESULTS

Results from the simulations based on the RADARSAT image (Image 1) are represented in Figure 10 (using non-modified relaxation rate) and Figure 11 (88% reduction of the relaxation rate). For comparison purposes, the original Image modulation is represented as a solid black line. Image modulation may be described as a sudden increase of the relative NRCS along the normal section of the thermal front,



**Figure 9.** Representation of the synthetic current (left) and wind (right) fields employed as inputs on the Experiments for Image 1. Graphics depict current and wind velocity variations along an imaginary transect crossing the BC front. Vertical gray lines mark the center of the front (xc): the areas at the left side represent the continental shelf area, while the right side represent the BC area. a) Experiment 1: null current field with a spatially varying wind field; b) Experiment 2: spatially varying wind field and current field assuming a divergence of  $-3 \times 10^{-5} \, s^{-1}$ , and a shear of  $-4 \times 10^{-5} \, s^{-1}$ ; c) Experiment 3: spatially varying wind field and current field assuming a divergence of  $1 \times 10^{-4} \, s^{-1}$  and a shear of  $-4 \times 10^{-5} \, s^{-1}$ . Dashed black lines represent the velocity components normal to the front; solid black lines represent the velocity components parallel to the front.



**Figure 10.** Results from simulation experiments related to Image 1 (RADARSAT-1, solid black lines), without modifying the original relaxation rates. Graphics represent sections of relative NRCS (vertical axis) along a normal transect crossing the BC front: a) Considering the effect of shear  $(-4 \times 10^{-5} \text{ s}^{-1})$  alone (dashed black line), while assuming an homogeneous wind field (5.84  $ms^{-1}$ ); b) Considering the effects of shear and divergence values of -3 ×  $10^{-5} s^{-1}$  (dashed black line), and -1 ×  $10^{-4} s^{-1}$  (gray line), while assuming an homogeneous wind field; c) Considering the effects of a spatially varying wind field (5.84  $ms^{-1}$  to  $10 ms^{-1}$ , assuming a direction  $\emptyset = 131^{\circ}$ ) (dashed black line); d) Considering the effects of shear and divergence values of -3 ×  $10^{-5} s^{-1}$  (dashed black line), and -1 ×  $10^{-4} s^{-1}$  (gray line), while assuming a spatially varying wind field.

depicting a step-like pattern: colder waters in the inner sector of the continental shelf are characterized by lower values of relative NRCS, while higher values are related to the warmer BC waters, found offshore of the front. Maximum modulation was of approximately 3.5 dB, when ignoring the effects caused by speckle noise.

Experiments testing only for hydrodynamic modulation and considering only the shear effects yielded lower modulations (Figures 10a and 11a). In such cases maximum modulation was of a mere 0.05 dB, irrespective of changes in the relaxation rates. Nonetheless, a weak step-like pattern persisted, despite the low modulation.

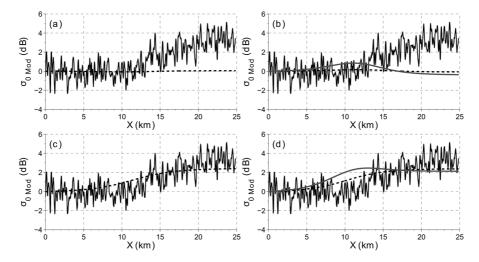


Figure 11. Same as Figure 10, considering an eighty-eight percent reduction of the relaxation rates.

When considering both shear and divergence  $(-3 \times 10^{-5} \, s^{-1})$ , the simulated NRCS modulation across the front was again low when compared to the observed one in the original image (Figures 10b and 11b, dashed black line). The NRCS changes on the transect were characterized by a peak at the front (+0.05 dB modulation for simulation with no relaxation rate changes and +0.15 dB for relaxation modified), dropping to negative modulations of NRCS in the inside BC region. The modulation was higher when compared to the results from the previous experiment (having only a current shear), but were still well below the image benchmarks. With the inclusion of a higher divergence ( $-1 \times 10^{-4} \, s^{-1}$ ), maximum modulations reached approximately 0.30 dB (no relaxation rate changes) and 0.85 dB (relaxation modified) with similar spatial patterns of NRCS modulations in both simulated results (no changing/changing the relaxation rate) and previous simulation (Figures 10b and 11b, gray line).

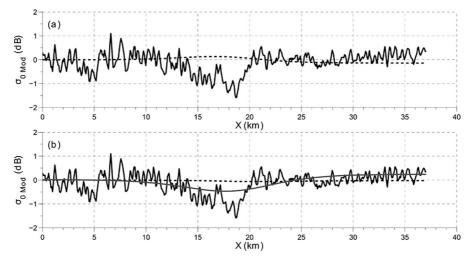
The experiments evaluating only the effects of ABL instabilities also produced step-like modulation patterns (Figures 10c and 11c). This time, simulated modulations were closer to those of the image, reaching +2.26 dB with unadjusted relaxation rates, and +2.39 dB with modified relaxation rates. When considering the ABL instabilities, with current shear ( $-4 \times 10^{-5} \ s^{-1}$ ) and divergence ( $-3 \times 10^{-5} \ s^{-1}$ ) (Figures 10d and 11d, dashed black line), simulated modulations appeared as a step-like pattern, reaching +2.26 dB in the unadjusted case, and +2.37 dB in the decreased relaxation case. The insertion of a higher divergence ( $-1 \times 10^{-4} \ s^{-1}$ ) (Figures 10d and 11d, gray line) resulted in a step-like pattern and a lower modulation (+2.04 dB) for unadjusted relaxation rates. When the

relaxation rates were decreased a higher modulation (+2.43 dB) was observed at the center of the front, while the external areas were characterized by a decrease (+2.11 dB) in the relative NRCS.

Results from experiments based on Image 2 (ASAR/Envisat) are represented in Figure 12 (using a non-modified relaxation rate) and Figure 13 (88% reduction of the relaxation rate). Modulations in the Envisat image (Figures 12 and 13, solid black line) were characterized by a reduction of NRCS modulation at the front, reaching approximately -1dB, when speckle noise is not considered. The NRCS modulation returns to approximately zero value in inside the BC region.

As has already been stated, all the experiments involving Image 2 considered only hydrodynamic modulation effect, and homogeneous wind fields. In the first experiments, where only shear effects ( $-4 \times 10^{-5} \ s^{-1}$ ) were considered, the simulated modulations showed a positive peak in the frontal region (Figures 12a and 13a), reaching approximately +0.13 dB under original relaxation rates, and +0.25 dB under the 88% reduction treatment.

When considering both shear ( $^{-4} \times 10^{-5} \ s^{-1}$ ) and divergence ( $3 \times 10^{-5} \ s^{-1}$ ) (Figures 12b and 13b, dashed black line), modulations appeared at the front, reaching -0.06 dB (original relaxation rate). A decrease in the relaxation rates yielded modulations of -0.16 dB. The insertion of a more intense divergence ( $1 \times 10^{-4} \ s^{-1}$ ) resulted in an increase of the modulations at the center of the front (Figures 12b and 13b, gray line). NRCS modulation reached -0.47 dB when under unchanged relaxation rates. The Experiment assuming the reduction of the relaxation rates yielded simulated modulations up to -1 dB, attaining the levels present on the ASAR/Envisat image.



**Figure 12.** Results from simulation experiments related to Image 2 (ASAR/Envisat, solid black lines), without modifying the original relaxation rates. Graphics represent sections of relative NRCS (vertical axis) along a normal transect crossing the BC front: a) Considering the effect of shear  $(-4 \times 10^{-5} \, s^{-1})$  alone (dashed black line), while assuming an homogeneous wind field (5.84  $ms^{-1}$ ); b) Considering the effects of shear and divergence values of  $3 \times 10^{-5} \, s^{-1}$  (dashed black line), and  $1 \times 10^{-4} \, s^{-1}$  (gray line), while assuming an homogeneous wind field.

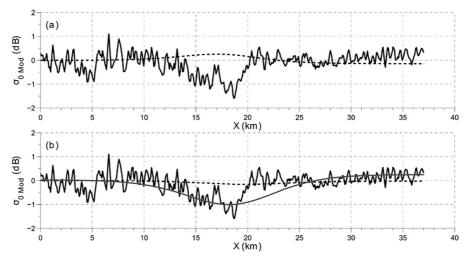


Figure 13. Same as Figure 12, considering an eighty-eight percent reduction of the relaxation rates.

# DISCUSSION

Simulated results clearly show that hydrodynamic modulation could not fully explain the modulation behavior seen on the RADARSAT image (Image 1) transect across the BC front. Both experiments, considering shear and shear/divergence effects, yielded simulated modulations of the relative NRCS much lower than the real modulations of Image 1. Nonetheless, the introduction of divergence effects resulted in slightly higher modulations, but also created a peak in the center of the front that did not reproduce the NRCS behavior observed in Image 1.

Regarding simulations considering shear or divergence effects, the reduction of the relaxation rates increased the NRCS values and increased the modulation peak in the center of the front. Increasing the divergence by one order of magnitude (10<sup>-4</sup>) resulted in a further increase of the relative NRCS peak.

The simulated NRCS modulations considering only the ABL effects or ABL effects in combination with shear and lower divergence ( $3 \times 10^{-5} \ s^{-1}$ ) effects were closer to the original modulations seen on Image 1. Results were better for both, the spatial pattern (step-like pattern) and the modulation value, even though the maximum simulated

modulation remained below the maximum original modulation in Image 1. The inclusion of a higher divergence  $(1 \times 10^{-4} \, s^{-1})$  reproduced the same step-like pattern when considering no change in relaxation rate. However, the maximum simulated modulation is lower than when using a smaller order of magnitude divergence (10<sup>-5</sup>). A higher divergence in combination with a decrease in the relaxation rate generates a NRCS modulation peak at the front and a decrease in NRCS modulation in the inner BC region; this modulation pattern is not compatible with that of the SAR image. The strong concentration of the divergence near the front in conjunction with the decreased relaxation rate value produces a peak in the NRCS modulation at the front. As we move away from the front, the divergence decreases with the result that its effect on the NRCS is reduced as compared with that on the frontal region.

These results show that the changes in NRCS seen on Image 1 were best explained by spatial changes in the wind speed field, caused by atmospheric instabilities originated from the contrasts between warmer offshore waters (BC) and colder onshore waters with the overlying atmosphere. In this case, a step-like NRCS modulation pattern would be expected, as local increases in wind stress would increase Bragg wave height spectrum and ocean surface roughness, leading to higher NRCS modulations on the warmer side of the front (KUDRYAVTSEV et al., 2005). Although not accounted for in this study, wave breaking caused by higher wind speeds may also increase the NRCS signal at the warmer (internal BC) side of the front. When considering the case presented by Image 1, the relative contributions from hydrodynamic modulation are negligible; leading to non-acceptable modulation patterns even when higher divergence and lower relaxation rate are considered.

However, it is important to note that the variation of the wind speed across the front as calculated in this study was relatively high  $(4.16\ ms^{-1})$ . It is possible that this high wind variation across the BC front, determined using UFERMANN and ROMEISER (1999) methodology and M4S simulations, has been over-estimated. The M4S assumes a neutral stability ABL. As has been well documented by KUDRYAVTSEV et al. (2005), a higher ABL instability on the warm side of a front has the effect of increasing the wind drag coefficient  $(C_d)$  and consequently increasing the wind stress  $(\tau)$  and the friction velocity  $(u^*)$ . Therefore, if the ABL instability is taken into account, a lower variability of the wind speed in the frontal region could produce a similar  $u^*$  change associated with a higher variability of the wind speed in

a neutral ABL model. Hence, further studies should be conducted in order to validate this wind change across the BC frontal region.

Using simulation experiments based on SIR-C/X-SAR (operating on C, L and X band) images, UFERMANN and ROMEISER (1999) concluded that the SAR signatures of the Gulf Stream front were influenced both by ABL instabilities and by variations in the surface current fields. Nonetheless, their results also show that HH and VV polarizations were more sensitive to wind speed variations than to shear and divergence effects in frontal regions. This is consistent with our results for Image 1 (HH Polarization), even though hydrodynamic modulation effects were small for SAR signatures at the BC front.

Simulations based on Image 2 (ASAR/Envisat) yielded positive modulations at the front center while assuming shear effects alone, leading to an inverse modulation pattern. The insertion of an ADCP derived divergence led to a more realistic pattern, even though the magnitude of the negative NRCS peak found at the front center remained well below the original peak observed on Image 2. The increase in the divergence input resulted in a further improvement of the results, reaching 47% of the NRCS amplitude found on Image 2. When reducing the relaxation rate, the simulated pattern of relative NRCS was very close to the original NRCS modulations found in the ASAR/Envisat image.

The best simulated results based on Image 2 were obtained only through the increase of divergence by one order of magnitude ( $10^{-4} \ s^{-1}$ ). This value remains below the divergence values found in some other oceanic surface frontal zones such as the Norwegian Coastal Current (up to  $-4.5 \times^{-4} \ s^{-1}$ ) (KUDRYAVTSEV et al., 2005), which were also based on ADCP data. Results obtained by UFERMANN and ROMEISER (1999) for the Gulf Stream front also showed a better agreement with real data when introducing a divergence of  $5 \times 10^{-4} \ s^{-1}$ . Nonetheless, UFERMANN and ROMEISER (1999) considered this value as an overestimate of the front divergence, and according to the authors this is a figure subject to further investigation.

We should highlight that the spatial resolution of the ADCP data employed here might be too coarse to provide an adequate representation of the current field variability at the BC front. The available ADCP data were provided at spatial sampling intervals of 5.3 km, almost corresponding to the physical extent of the BC front itself which, according to LORENZZETTI et al. (2009), should be of 5.7 km or less. We must also consider the differences

between ADCP acquisition dates from the remote sensing imaging. Thus, real divergence at the BC front at the time of imaging might be one order of magnitude higher than our estimates. Divergence might also vary on shorter time scales, which would also justify the uneven appearance of SAR signatures at the BC front.

In all the experiments, as was expected, a reduction of the relaxation rate caused a general increase in the NRCS modulations and was more evident in the hydrodynamic modulation experiments. The relaxation rate determines the strength of the hydrodynamic modulation, following the Weak Hydrodynamic Interactions Theory (BRANDT et al., 1999). It is calculated as the inverse of the relaxation time. Hence, a strong decrease of the relaxation rate as was done in our simulation would increase the relaxation time by the same factor. The relaxation time measures the imbalance period caused by short-wave variations in the current field, meaning that a longer relaxation time would allow the development of a stronger hydrodynamic modulation. The length of the relaxation time depends on the combination of wind excitation, the energy transfer caused by conservative wave-wave interactions, and energy losses due to dissipative processes, such as the wave breaking, for example (ALPERS; HENNINGS, 1984).

# CONCLUSION

Under well controlled and specified model configurations, simulated NRCS anomalies at frontal zones showed good agreement with signals found on real SAR images, attesting the potential of the M4S SAR imaging simulation model in studies directed to examine physical mechanisms at ocean fronts. For the Brazil Current frontal zone observed in Campos Basin, both hydrodynamic and aerodynamic modulations may operate, creating distinct NRCS signatures. Nonetheless, current shear alone cannot explain NRCS modulations at the front. Realistic results might consider the joint effects from shear and divergence, as the interactions between both phenomena may influence the signature of the BC thermal front in SAR images.

SAR image simulation studies for the BC front must include a reduction of the relaxation rate, as it may often intensify the resulting modulations, especially when the influence of the hydrodynamic modulation is more pronounced. Conversely, when ABL instabilities dominate the signal modulations, a reduction of the relaxation rate may obliterate the modulation patterns when the hydrodynamic modulation is considered.

The good results observed in the ABL instability simulations may be related to the method employed to determine wind speed variations across the frontal zone, since simulations with the M4S model were also used to calculate reference wind speeds.

For future studies, we suggest the inclusion of wave breaking effects in the SAR imaging simulations, as the contribution from this phenomenon is enhanced under HH polarizations and incidence angles higher than 30°. We also suggest comparison studies using outputs from the Kudryavtsev SAR imaging simulation model (KUDRYAVTSEV et al., 2003a; 2003b; 2005), which may help to assess the effects of wave breaking, as well as from surfactant accumulations at the front. Such an approach may help to increase the correlations between real and simulated modulations, especially in cases where convergence zones are developed at the front.

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