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# On radar imaging of current features: 2. Mesoscale eddy and current front detection

J.A. Johannessen<sup>1,2</sup>, V. Kudryavtsev<sup>3,4</sup>, D. Akimov<sup>4</sup>, T. Eldevik<sup>1,5</sup>, N. Winther<sup>1</sup> and B. Chapron<sup>6\*</sup>

Abstract: The surface signatures of meandering fronts and eddies have been regularly observed and documented in synthetic aperture radar (SAR) images. Wave-current interactions, the suppression of short wind waves by natural film, and the varying wind field resulting from atmospheric boundary layer changes across an oceanic temperature front all contribute to the radar image manifestation of such mesoscale features. The corresponding imaging mechanisms are quantitatively explored using a new radar imaging model (Kudryavtsev et al., 2005) that solves the energy balance equation where wind forcing, viscous and wave breaking dissipation, wave-wave interactions, and generation of short waves by breaking waves are taken into account. High-quality and synoptic in situ observations of the surface conditions should ideally be used in this model. However, such data are rarely available. Instead, the fields of temperature and ocean current are herein derived from two distinct numerical ocean models. SAR image expressions of current fronts and eddies are then simulated based on these fields. The comparison of simulated images with European Remote Sensing (ERS) SAR and Envisat advanced SAR (ASAR) images is favorable. We consequently believe that the new radar imaging model provides promising capabilities for advancing the quantitative interpretation of current features manifested in SAR images.

**Keywords:** imaging radar model; mesoscale feature detection

<sup>&</sup>lt;sup>1</sup>Nansen Environmental and Remote Sensing Center, Bergen, Norway

<sup>&</sup>lt;sup>2</sup>Geophysical Institute, University of Bergen, Norway

<sup>&</sup>lt;sup>3</sup>Marine Hydrophysical Institute, Sebastopol, Ukraine

<sup>&</sup>lt;sup>4</sup>Nansen International Environmental and Remote Sensing Center, St.Petersburg, Russia

<sup>&</sup>lt;sup>5</sup>Bjerknes Center for Climate Research, Bergen, Norway

<sup>&</sup>lt;sup>6</sup>Institute Français de Recherche pour l'Exploitation de la Mer, Plouzane, France

<sup>\*:</sup> Corresponding author : <a href="mailto:Bertrand.Chapron@ifremer.fr">Bertrand.Chapron@ifremer.fr</a>

# 1. INTRODUCTION

Upper ocean fronts and eddies are dynamic features that importantly contribute to the mesoscale variability, the coupled physical-biochemical processes and rapid changes in the air-sea interaction. Such features are usually manifested by the sea surface temperature pattern and chlorophyll a concentration in thermal infrared and visible satellite remote sensing images. In synthetic aperture radar (SAR) images they are manifested due to sea surface roughness changes (e.g. Fu and Stewart, 1983; Alpers, 1985; Johannessen et al., 1996; Lyzenga, 1996; Johannessen et al., 1997; Font et al., 2002; Lyzenga et al., 2002). Quantitative analyses of current strength and variability connected with such remotely sensed features are not trivial and hitherto mostly limited to simplified cases. A major reason for this, in particular regarding SAR images, is the complex interplay between physical processes and the challenging demand for coincident high quality in-situ data. Ideally this should include observations of the surface wind field, surface waves, surface current, and presence of damping surfactant material. In addition, knowledge of the changes in the atmospheric boundary layer stratification and thus surface stress in the presence of a sea surface temperature front are also required. The availability of such a range of coincident data at high spatial resolution is extremely rare.

Consequently, there is a lack of systematic use of SAR images for studies of frontal features and their impact on the mesoscale variability of current systems such as the

Gulf Stream and coastal boundary currents. However, the fundamental equations for SAR imaging of surface current features have gradually become better known (Alpers and Hennings, 1984; Lyzenga and Bennett, 1988; Apel, 1994; Romeiser and Alpers, 1997; Romeiser et al., 2001; Kudryavtsev et al., 2004) and can now be applied to simulate SAR image expressions. Figure 1 schematically outlines the main steps of the new radar imaging model (RIM) by Kudryavtsev et al. (2004) (hereafter referred to as Part1). Based on detailed quantitative characterization of the surface current, the near surface wind field, and the presence of surfactants, the conservation of wave action (i.e. energy balance) is invoked to consistently describe the surface roughness modulations. The roughness is partitioned into larger scale waves and small scale Bragg waves. The mean square slope (mss) of larger scale waves contribute directly to specular reflection (sp), but also to Bragg (br) scattering by means of the tilting of shorter waves. In addition, wave breaking (wb) of larger scale waves alter the surface roughness and generate smaller scale Bragg waves. In turn, the total surface scattering properties can be quantified and used to simulate the normalized radar cross-section (NRCS) applicable to real aperture radar imaging.

In this paper, the demand for high quality *in-situ* validation data is bypassed by the alternative use of surface fields of temperature and current derived from numerical ocean models. The models are a fine resolution (650 m) process model (Eldevik and Dysthe, 2002) and an operational model of the Norwegian Coastal Current (NCC) at 2-4 km resolution (Bertino et al., 2004; Albretsen et al., 2004). These model data are used to feed the RIM of Part1. In section 2 we briefly describe the major steps of the

RIM, while the imaging of frontal eddies is simulated and compared with SAR images in section 3. Building on this, the SAR imaging of coastal current features is simulated in section 4 followed by a comparison with SAR observations. A summary with concluding remarks is then provided in section 5.

#### **INSERT FIGURE 1**

# 2. SAR SIGNATURES OF SURFACE CURRENT FEATURES

# 2.1 The major steps of the RIM

As discussed and highlighted in Part1, the RIM provides consistent insight into the physics responsible for the image manifestation of surface current features building on Kudryavtsev et al. (2003a,b). In the following we briefly outline the RIM (Figure 1) in Part1, where a module for surface roughness estimation is combined with a module for predicting the NRCS for VV- and HH-polarization (p). The latter accounts for the Bragg scattering ( $\sigma_{br}^p$ , 2-scale model), the quasi-specular contribution ( $\sigma_{sp}$ ) and the impact from breaking waves ( $\sigma_{wb}$ ) such that the NRCS is given by

$$\sigma_0^p = (\sigma_{br}^p + \sigma_{sp})(1 - q) + \sigma_{wb}q \tag{1}$$

where q is the fraction of the sea surface covered by breaking waves. These three scattering mechanisms depend on the radar wavelength, polarization and incidence

angle. Within the frame of the composite model, the range of longer surface waves providing tilt and specular contribution is defined as  $k < d \cdot k_r$ , where  $k_r$  is the radar wavenumber and d = 1/4 is the dividing parameter. The main characteristics of longer waves contributing to  $\sigma_{br}^p$  and defining  $\sigma_{sp}$  are their mss in up- and cross-wind directions ( $S_1^2$  and  $S_2^2$  respectively), which are related to the saturation spectrum B(k) of wind waves as

$$s_j^2 = \int_{k < dk} \kappa_j^2 k^{-2} B(\mathbf{k}) d\mathbf{k}$$
 (2a)

where  $\kappa_j$  is a component of the unit wavenumber vector.

The impact of wave breaking is described as the integrated effect of steep patches of breaking waves that contribute to the radar return  $(\sigma_{wb})$  by reflection. This contribution is proportional to the fraction of the sea surface q covered by breaking zones. This quantity, as well as the energy dissipation from wave breaking, is described using the wave breaking characteristics originally introduced by Phillips (1985). As shown in Part1, q can then be expressed via the saturation spectrum q and wind wave growth rate q as

$$q = c_q \iint_{k < k_{\text{out}}} \beta \left( B + (n_g + 1)\tilde{B} \right) d\varphi d \ln k$$
 (2b)

where  $c_q$  is a constant,  $\beta = C_{\beta}(u_*/c)^2 \cos \varphi |\cos \varphi|$ ,  $n_g = 5$  is a parameter related to the choice of spectral dissipation, and  $\varphi$  is the angle between the wind direction and wavenumber vector. Hereafter, tilde denotes the variation of any quantity with respect to the background values.  $\beta$  attains negative values for waves propagating at more than  $90^{\circ}$  to the wind direction. In such cases the wind waves attenuate and lose their energy interacting with the opposing wind (Lyzenga, 1996; Kudryavtsev and Johannessen, 2004).

The spectrum of Bragg waves, waves defining the mss (eq. 2a) and the wave breaking (eq. 2b) that in total contribute to the NRCS ( $\sigma_o^p$ ) are all found by solving the wave energy conservation equation in the roughness module of the RIM. For any small roughness disturbances, the wave action N conservation equation reads

$$\partial \tilde{N}(\mathbf{k})/\partial t + c_{gi}\partial \tilde{N}(\mathbf{k})/\partial x_{i} =$$

$$= \omega^{2} k^{-5} \left[ \omega^{-1} m_{k}^{ij} u_{i,j} B_{0} - \tilde{B}/\tau + \tilde{\beta} B_{0} + \tilde{I}_{sw} \right]$$
(3)

where  $c_{gi}$  and  $u_{i,j}$  are the wave group velocity and surface current; i and j =1,2;  $\omega$  and **k** are the intrinsic frequency and wave number vector (with components  $k_i$ ) related by the dispersion relation:

$$\omega^2 = gk + \gamma k^3 \tag{4}$$

In the above  $k \neq \mathbf{k}$ , g is the acceleration of gravity, and  $\gamma$  is the surface tension. The saturation spectrum B relates to N as  $N(\mathbf{k}) = \omega k^{-5} B(\mathbf{k})$ ,  $m_k^{ij} = k_j \partial \ln N_0 / \partial k_i$  is a tensor of the "wavenumber exponent" of the spectrum,  $u_{i,j}$  is the current velocity gradient tensor  $\partial u_i / \partial x_j$ ,  $\widetilde{\beta}$  represents the variations in wind wave growth rate which are proportional to the wind surface stress variations, and  $T_{sw}$  is the rate of short wave modulations due to the modulation by the breaking of the longer, intermediate waves,

$$\mathcal{T}_{sw}(k) = \frac{c_b}{2\alpha} \omega^{-1} (n_g + 1) \iint_{k < k_m} \omega \beta \widetilde{B} d \ln k' d \varphi$$
 (5)

The operator  $m_k^{ij} u_{i,j}$  is

$$m_{k}^{ij} u_{i,j} =$$

$$= m_{k} (\cos^{2} \varphi \cdot u_{j,j} - \cos 2\varphi \cdot u_{2,2}) + 1/2 m_{\varphi} \sin 2\varphi \cdot (u_{2,2} - u_{1,1}) +$$

$$1/2 m_{k} \sin 2\varphi \cdot (u_{2,1} + u_{1,2}) - m_{\varphi} (\sin^{2} \varphi \cdot u_{2,1} - \cos^{2} \varphi \cdot u_{1,2})$$

$$(6)$$

where  $\varphi$  is the angle of the wavenumber vector and

$$m_k = \partial \ln N / \partial \ln k$$
,  $m_{\varphi} = \partial \ln N / \partial \varphi$ .

Both the surface current and the near surface wind are considered stationary in the simulations. If we assume that the spatial scale of the surface current L is larger than

the relaxation scale  $l_r = \omega^{-1} \tau c_g$  where  $\tau$  is a dimensionless relaxation time, then the advective term on the left hand side of eq. (3) can be ignored, and the equation reduces to

$$\widetilde{B}(\mathbf{k})/B_0(\mathbf{k}) = \tau \left( w^{-1} m_k^{ij} u_{i,j} + 2\beta \widetilde{u}_* / u_* + \widetilde{T}_{sw} / B_0 \right)$$
(7)

This expression clearly emphasizes the role of the main mechanisms responsible for the surface roughness modulations: surface current gradients (first term), varying surface wind stress (second term), and wave breaking from intermediate waves (third term). The effect of surfactants is also included in the background spectrum  $B_0$  through the effective molecular viscosity coefficient (cf. Part1). Notice that the contribution from wave breaking to shorter roughness scale modulations is a salient feature of the proposed model. Indeed, the direct effect of current changes to short waves is negligible due to the weak relaxation rate. Thus, the roughness modulation by intermediate wave breaking appears as the dominant source in the presence of a current. This source is mostly isotropic, and the relaxation time  $\tau$  takes larger values at cross-wind directions. Hence, wave-current interactions and subsequent wave breaking, notably more intense for the intermediate waves, result in more isotropic surface roughness (Kudryavtsev and Johannessen, 2004).

As already emphasized in Part1, a varying surface stress results from changes in the atmospheric boundary layer across a sea surface temperature front. In passing from the relatively colder to the warmer side, the atmospheric stratification might become

less stable. In turn, the surface stress increases and roughness modulations are produced.

Among the different components of the surface current gradient tensor, the dominant contribution is mostly related to effects of convergence and divergence. Indeed, the variations in the mean square slope and wave breaking as well as Bragg wave modulations (via the intermediate scale wave breaking mechanism), are all strongly affected by such current gradients. Assuming that the  $x_1$ -axis is aligned with the wind, the integral of  $m_k^{ij}u_{i,j}$  multiplied by any even function (e.g., B or  $\beta$ ) over  $\varphi$  is zero. If the function has a wide angular spreading (like B in the equilibrium gravity range), then the main contribution to the integrals over  $\varphi$  comes from the first term in eq.(6), and the operator may be approximated by

$$m_k^{ij} u_{i,j} \approx m_k \nabla \cdot \mathbf{u} \tag{8}$$

The breaking of intermediate waves in the equilibrium range, where the angular spreading of the spectrum is wide, mainly causes the fraction of the sea surface covered by enhanced roughness zones. Consequently, enhancement and suppression of surface roughness occur in the zones of convergence and divergence, respectively.

Interestingly, surfactants also tend to accumulate in the zones of the current convergence to dampen short wind waves. The effects of pure wave-current interaction and surfactant damping may then lead to opposite radar signatures for current convergence areas. It is reasonable to anticipate that the resulting net effect depends on the wind conditions, the magnitude of the current convergence and the properties of any surfactant material present.

# 2.2 The RIM sensitivity

To illustrate and quantify these different SAR imaging effects, a series of basic RIM simulations for C-band radars are presented assuming two simple linear current fields:

a) convergent current:

$$u_1(x_1) = -u_{01}F(x_1/L), \ u_2 = 0$$
 (9)

and b) shear current:

$$u_1 = 0, \quad u_2(x_1) = u_{02}F(x_1/L)$$
 (10)

where the profile function takes the form  $F(x) = (1 + \tanh(x))/2$ . Across the current front (assumed to have a width of L=250m starting from  $x_1$ =0) the x- and y-components of the current increase from 0 to  $u_{01} = u_{02} = 0.5 m/s$  at  $x_1$ =250 (Fig. 2a). The corresponding current convergence and positive shear thus reach a maximum of  $0.4 * 10^{-3} \text{ s}^{-1}$ .

Figure 2 (b-f) illustrates the RIM results for the convergent current assuming a wind speed of 5 m/s directed along the  $X_1$ -axis. The peak over background (POB) ratio of the NRCS at VV and HH polarization, for the down- and cross-wind radar look directions, and for the two incidence angles  $\theta = 20^{\circ}$  and  $\theta = 40^{\circ}$  are plotted. At an incidence angle of 20°, the POB ratio for the cross-wind direction is 2.7 and slightly larger compared to the down-wind direction at about 2.3 (Fig. 2b,c). The magnitude and shape of the HH and VV polarizations have no distinct differences for the two cases. In the vicinity of maximum convergence the wave breaking is significantly enhanced compared to the background level (Fig.2d). The mean square slope and omni-directional spectrum of Bragg waves are also intensified in the convergence zone, although the magnitudes of their modulations are much less pronounced (Fig. 2d). At  $\theta = 40^{\circ}$  the POB ratio for HH polarization is markedly higher than for VV but clearly less than at  $\theta = 20^{\circ}$  (Fig. 2e). This arises from the effect of wave breaking which provides a relatively stronger modulation on the radar scattering for HH as shown in Part1. In contrast, the POB ratio for the cross-wind radar look direction case at  $\theta = 40^{\circ}$  (Fig. 2f) is in closer agreement with the results at  $\theta = 20^{\circ}$ . The large POB ratio in this direction results from the significantly higher sensitivity of Bragg waves to surface current at cross- than at downwind radar look directions.

#### **INSERT FIGURE 2**

The impact of a "pure" shear current on wind wave modulations is found to be relatively negligible and is not shown. This result seems at first to disagree with the

numerous radar manifestations of current boundaries that are known to have significant shear current (i.e. Johannessen et al., 1996; Lyzenga et al. (2002)). Note, however, that here we only consider shear currents normal to the wind direction. Johannessen et al., (1996) have also reported that in cases with pure shear currents perpendicular to the wind- and look direction the effect of the shear on the radar cross section modulation is negligible. When shear currents, on the other hand, are neither perpendicular nor along the wind- and look direction, the integral statistical properties of the sea surface roughness (see eq. 8) may experience modulations that are manifested in the SAR image.

The general non-stationary nature of meandering currents, including local zones of convergence and divergence thus explains the image manifestation of shear currents. Using the conservation of vertical vorticity ( $\Omega_z$ ),

$$\frac{d\Omega_z}{dt} = -(\Omega_z + f)\nabla \cdot \mathbf{u} \tag{11}$$

(with f being the Coriolis paremeter) it follows that convergence (divergence) increases (decreases) the shear. This equation predicts the existence of oscillating linear convergence and divergence zones distributed along the current shear front. For small perturbations this is approximated by

$$\frac{\partial \varsigma}{\partial t} \frac{\partial^2 u_2}{\partial x_1^2} \approx -\left(f + \frac{\partial u_2}{\partial x_1}\right) \nabla \cdot \mathbf{u} \tag{12}$$

$$u_2(x_1, x_2) = u_{02} F[(x_1 - \varsigma)/L]$$
(13)

To model the corresponding radar signature of this meandering current, we specified  $C = u_{02}/2$ , aK = 0.5 and as before the frontal width L = 250m. The corresponding divergence and convergence of the current and induced velocity component  $u_1$  are shown in Figure 3a. The perturbation velocity of the meander perpendicular to the front exceeds 0.2 m/s, while the magnitude and shape of the convergence and divergence are symmetric at the center of the front reaching maxima of about 0.5 \*  $10^{-3}$  s<sup>-1</sup>.

Since the direct impact of the current shear is negligible, both surface roughness contrasts and NRCS modulations are solely caused by the convergence and divergence of the meandering shear current displayed in Figure 3a. The corresponding sensitivities of the NRCS to the same radar parameters as in Figure 2 (b-f) are then plotted in Figure 3 (b-f). With the exception of the shape of the POB ratio the general findings and conclusions are, not surprisingly, complementing those for the pure convergence case. The effect of wave breaking in the vicinity of the maximum convergence zone dominates the contribution to the NRCS anomalies, the cross-wind radar look direction gives the largest POB ratio of about 2.3 at  $\theta = 20^{\circ}$  and 2.2 at  $\theta = 40^{\circ}$ , and

VV versus HH ratio display marked differences only at  $\theta = 40^{\circ}$ . The effects of the divergence along the shear current are specifically found for a POB ratio below 1, i.e., these zones produce surface roughness less than the average background roughness. Consequently, the simulated radar signal portrays zones of bright and dark NRCS anomalies along the frontal zones. This is also commonly observed in SAR images (e.g., Johannessen et al., 1996).

## **INSERT FIGURE 3**

In order to account for the effect of changes in the marine atmospheric boundary layer (MABL) on the radar imaging, the simulation is expanded to include an accompanying change in the sea surface temperature. We consider a step-like temperature front with a drop of 3° C. The MABL stratification on the up-wind side of the front is assumed to be neutral. The model simulations are in this case revealing surface roughness changes from the combined effect of varying wind stress in the MABL (induced by the sea surface temperature front) and surface current convergence and divergence (induced by the meandering current). The results are plotted in Figure 4 a-f, using the previously specified radar parameters. The overall characteristics of these results clearly agree with the previous findings, notably regarding the importance of wave breaking in the vicinity of surface convergence, and the radar look direction. However, in this case the POB ratio distinctively remains equal to or below 0.5 on the downwind cold and stable side of the front in contrast to the signals in Figures 2 and 3. The changes in the stratification of the MABL and subsequent wind stress changes

produce a step-like drop of the surface roughness and the magnitude of the radar signal at the down-wind side of the front.

# **INSERT FIGURE 4**

The results of these RIM simulation experiments are in agreement with the comparison between modeled and observed NRCS for the CoastWatch95 experiment as reported by Kudryavtsev et al. (2003) and Part1. As found, the enhanced wave breaking in the vicinity of the surface current convergence zones explains fairly well the delta-like NRCS increase. However, such delta-like increase can gradually shift to a combined delta- and step-like change provided the joint effects of the surface current divergence and the changes in the wind stress are considered. For a given strength of convergence, the latter will therefore lead to the largest NRCS contrasts.

Building on these promising 1-D sensitivity results we will in the next sections examine the capability of the RIM to simulate the 2-D imaging of frontal eddies and coastal current features. The background data of sea surface current, surface temperature and wind speed to be fed into the RIM are entirely taken from 3-D numerical ocean models, sidestepping the problem of lacking *in-situ* data.

## 3. FRONTAL EDDIES

The upper ocean is rich in mesoscale structures such as fronts and eddies. A distinct example is the so-called spiral eddies. They are rather intense surface layer cyclones with a diameter of about 10 km. Photographs of the world oceans from space shuttles (Scully-Power, 1986; Munk et al. 2000), and images of Norwegian coastal waters from radar satellites (Dokken and Wahl, 1996; Johannessen et al., 1996), have shown that such eddies are common. A street of spiral eddies are shown in Figure 5a. The bright lines are narrow bands of surface film (slicks) that dampen short gravity-capillary waves to produce sun-glitter. Their signature is the opposite in radar images as such surfactant material suppresses the radar backscatter leading to narrow dark bands as illustrated in the SAR image (Figure 5b).

## **INSERT FIGURE 5**

In cases where no damping film material is present, the eddy features alter their expression into a bright radar modulation along the converging front as explained in Section 2. An example of such a SAR image expression of a 10 km in diameter cyclonic eddy in the Norwegian Coastal Current is shown in Figure 6a that generally depict the eddy boundary with a bright NRCS anomaly exceeding the background by up to 2-3 dB (Johannessen et al., 1996).

Eldevik and Dysthe (2002) recently put forward a conceptual model for the generation and evolution of spiral eddies. In meteorology, sharp fronts and cyclones are understood to be generated by the same baroclinic instability process (e.g., Garnier et

al., 1998). As an unstable frontal wave evolves, there is both sharpening of horizontal gradients perpendicular to the wave and nonlinear windup of the wave to produce cyclones. Eldevik and Dysthe (2002) suggest that buoyant geostrophic jets in the upper ocean are prone to produce unstable frontal waves ("bad weather") with wavelengths and growth rates consistent with the spirals. An example of the simulated surface flow pattern from their fine resolution (650 m horizontally, 5 m vertically) numerical experiments is shown in Figure 6b. A frontal wave is seen to wind up nonlinearly to reveal cyclonic spirals. Both modeled and observed spiral eddies are associated with streaks of strong cyclonic shear and convergence. Due to the convergence, the passive surface floating material accumulate to delineate the model eddies of Figure 6b. The experiments were done using the sigma-coordinate ocean model of Berntsen (2000).

#### **INSERT FIGURE 6**

The surface current field (Fig. 6b) with its zones of convergence and divergence (Fig. 6c) obtaining strength of about 10<sup>-4</sup> s<sup>-1</sup> are used in the RIM to produce the NRCS field shown in Figure 6d. For a near surface wind speed of 5 m/s from southwest (between cross-wind and downwind radar look direction) the NRCS contrasts along the eddy boundary reaches up to 2 dB. As emphasized in section 2, the enhanced wave breaking of intermediate waves in the vicinity of the zones of surface current convergence is the dominant source for the radar cross-section modulation and subsequent SAR image manifestation. This is confirmed by comparing the NRCS plot

(Fig. 6d) to the surface current divergence field (Fig. 6c) as well as the distribution of the passive floating material (Fig. 6b).

The relative importance of specular scattering, wave breaking and Bragg scattering to the total radar cross section is shown in Figure 7. With the exception of a narrow band in the vicinity of the convergence zone near the image center, the contribution from specular scattering (Fig. 7a) is below 10% and hence negligible. Moreover, the direct contribution from the breaking zones (Fig. 7b) to the NRCS can be ignored. Consequently, the indirect contribution from intermediate wave breaking via their influence on short wind waves dominates the surface roughness modulation, and thus Bragg-like scattering from the sea surface (Fig. 7c) and the SAR image manifestation (Fig. 7d). The total modulation depth across the simulated cyclonic eddy is about 2 dB (Fig. 7d) and compares reasonably well with the observed modulation depth of 2-3 dB (Fig. 6a). It also reveals some bands of bright-dark anomaly patterns that in section 2 were found to be associated with the combined effect of convergence and divergence. These are not evident in the SAR image. Nor is the image manifestation (Fig. 6a) revealing any step-like impact from transformation of the MABL stratification due to sea surface temperature fronts. Hence, this mechanism has not been included in the RIM simulation.

# **INSERT FIGURE 7**

Finally, we assess the impact of surfactants on the radar signature based on the fact that such short wave damping material are accumulated by frontal convergence as clearly illustrated by the "numerical slick" in Figure 6b. The elasticity of the surfactants collected in the convergence zones is assumed to be a constant equal to  $5mN/m^2$  (Ermakov et al., 1992), and becomes effective for a given convergence strength. Any real transport of surfactants into the convergence zones is not taken into account. As discussed in Part 1, the surface film elasticity defines the effective viscosity coefficient, which in turn affects the wave spectrum. The corresponding model calculations of the radar signature are shown in Figure 8 for winds of 5 m/s (a) and 15 m/s (b). As expected the surfactants significantly suppress the radar scattering. The 4 dB contrast of the dark features in Figure 8 (a) which is related to the convergence zones attain a shape in very good agreement to the pattern in Figure 6b. Consequently, "clean" surface convergence zones are bright, while the presence of surfactants will turn the NRSC of the convergence zones darker. At stronger wind conditions, the surfactant impacts gradually disappear (Figure 8b). At this speed the impact of the wind forcing therefore overpowers the effect of surfactant damping. The magnitude of the damping in these simulations are sensitive to the choice of elasticity. Hence they are not immediately comparable to the observed damping reported in Figure 5b, nor is it the scope of the paper to address the fate of surfactants at higher winds. Note also that no simulation is done for 3 m/s as we enter into the threshold wind speed for a C-band radar (Donelan and Pierson, 1987).

## **INSERT FIGURE 8**

These interesting image simulations consistently extend the clear picture derived from the 1-D sensitivity experiments conducted at the end of section 2. Overall, they compare well with the SAR image expression of similar eddy features. The next category of RIM simulations addresses the mesoscale current variability corresponding to the Norwegian Coastal Current.

## 4. MESOSCALE VARIABILITY

The simulated mesoscale variability of the northward flowing Norwegian Coastal Current (NCC) is shown in Figure 9a. The surface current and temperature fields contain meanders and eddies ranging from 20-50 km. The temperature front varies from 2 - 4° C, while the magnitude of the corresponding surface current ranges from 0.7-0.9 m/s (Fig. 9b). This simulation builds on the Hybrid Coordinate Ocean Model (HYCOM) developed by Bleck (2002) that has been implemented for the North Sea and Skagerrak (Bertino et al., 2004; Albretsen et al., 2004) with a spatial resolution of about 2-4 km. The model is forced with atmospheric fields provided by the European Center for Medium-range Weather Forecasting (ECMWF).

# **INSERT FIGURE 9**

The subsurface structures associated with the meanders and eddies in the NCC are revealing irregular rises and drops of the pycnocline of more than 50 m over distances

less than 5-10 km. This vertical density pattern can partly be connected with upwelling and downwelling events that are coupled with the areas of surface convergence and divergence.

The ocean model fields have been systematically compared and evaluated with data from repeated ship cruises and demonstrate that the model is able to represent the general distribution of the major water masses, notably the saline Atlantic water and the fresh coastal water (Bertino et al., 2004; Albretsen et al., 2004). Hence, it is assumed that the baroclinic structure and corresponding current field are realistic. However, there has been no systematic validation of the mesoscale variability and simulated surface current patterns due to lack of data. Based on the promising results obtained in section 3 it is therefore highly interesting to examine how the mesoscale features within the NCC modulate the background surface roughness pattern that, in turn, might lead to SAR image expressions of the mesoscale variability.

The mesoscale surface current field at 2 km resolution from Figure 9a is used to run the RIM. Moreover, a wind speed of 5 m/s at southerly (cross-wind) direction is used in consistence with the ECMWF field used to force HYCOM. The surface divergence map (a) and the corresponding NRCS (b) derived from the RIM are then compared in Figure 10. Note that the zones of convergence/divergence are bright (positive)/dark (negative) in Figure 10a. Maximum convergence reaches up to 4 \* 10<sup>-5</sup> s<sup>-1</sup>. This is almost an order of magnitude less than the convergence strength reported in section 3 and is most likely explained by the coarser (2-4 km) horizontal grid spacing in the

NCC model. However, in spite of this relatively weak convergence strength, its pattern and orientation is in striking qualitative agreement with the simulated NRCS (Figure 10b) distribution that displays a total change of NRCS of about 1.5 dB. Although this is weaker than the 2 dB contrast reported in Section 3 for a convergence of 2 \* 10<sup>-4</sup> s<sup>-1</sup>, it is again a clear confirmation that the NRCS anomalies mostly manifest the surface current divergence field.

## **INSERT FIGURE 10**

Capitalizing on this result we proceed with an examination of how well the Envisat ASAR image expression of the NCC off the southwest coast of Norway obtained on 9 May 2003 (Fig. 11a) can be interpreted using the RIM. The HYCOM realization of the surface current and surface temperature distribution, displaying a nearly 2° C thermal front (Fig. 11b), and the divergence field (Fig. 11c) for the same day are also shown. The corresponding simulated NRCS for a 5 m/s wind normal to the radar look direction is shown in Figure 11d.

# **INSERT FIGURE 11**

The ASAR image expression (not corrected for the antenna pattern) is fairly complicated with bands of bright and dark NRCS (Fig. 11a) predominantly confined within the area occupied by the NCC (Fig. 11b). The dominant wavelength of the modulation pattern is about 20-30 km with peak-to-background NRCS contrast

ranging from 1-3 dB. In comparison the mesoscale variability of the surface current within the NCC (Fig. 11b) also attain a dominant length scale of 30 km. The current strength associated with these features ranges from 0.4-0.6 m/s and is thus weaker than for the case discussed above. Nevertheless, the divergence field (Fig. 11c) reveals an abundance of zones of current convergence and divergence with magnitudes up to 2\* 10<sup>-5</sup> s<sup>-1</sup>. As above, this is an order of magnitude less than for the spiral eddies discussed in Section 3. In turn, the simulated NRCS obtains rather weak modulation depths up to 1 dB (Fig. 11d). The structure and orientation of the modulations, on the other hand, agrees very well with the dominant pattern in the convergence and divergence field. The distinct drop in the level of simulated NRCS within the NCC arise from the transformation of the MABL over the colder coastal surface water. This expression is not pronounced in the ASAR image and may be attributed to the real MABL regime (different wind speed and sea surface temperature) and hence wind stress as suggested by the weaker thermal front of about 1.3° C found in a simultaneous, but partly cloud covered satellite Advanced Very-High Resolution Radiometer (AVHRR) thermal infrared image (not shown).

Overall, this approach to interpreting SAR image expressions in the context of surface current convergence and divergence zones seems very promising. Combining numerical ocean models and the RIM thus appears as a powerful tool to either validate ocean models or quantify SAR images expressions of mesoscale current features as there are rarely sufficient quality and coverage by in-situ data.

## 5. CONCLUDING REMARKS

The ocean is rich in mesoscale dynamic features. Examples are meandering currents and eddy generation with distinct sea surface temperature fronts, the sporadic occurrence of filaments and jets, and wind driven coastal upwelling and downwelling. Due to a general lack of sufficient high quality in-situ observations, the understanding of how these dynamic features contribute to the complicated surface roughness modulation pattern often manifested in SAR images is incomplete. In turn, our ability to interpret and quantify surface current features imaged by SAR has not been adequately developed. Hitherto, the systematic use of SAR image observations for quantitative studies of the mesoscale ocean features has thus been hampered.

A novel approach has therefore been pursued in this paper. A forward model is used that combines a new consistent radar imaging model (Part1) with surface current and temperature fields obtained from two numerical 3-D ocean models at respectively 650 m and 2-4 km resolutions. These proxy data replace the desired high quality in-situ data. They are probably still too coarse to fully explain and quantify the SAR image manifestations. However, the model fields are homogeneously sampled and allow us to examine the relation between the simulated SAR image and the upper layer ocean structures.

A series of 1-D simulations were first undertaken to assess the RIM sensitivity to distinctive surface current and temperature conditions. The results emphasize the crucial role of current convergence and divergence that occur along meandering fronts

and eddies as well as the wind direction versus the SAR look direction. In the case of convergence, the surface roughness modulation comes from the direct and indirect effects of the breaking of intermediate scale waves that takes place within the converging zone due to wave-current interaction. This, in turn, produces the sharp delta-like intensity changes in the radar cross-section. In contrast, a pure shear current normal to the wind direction, leads to no detectable departure from the background surface roughness and NRCS.

For a meandering current front, zones of convergence and divergence are formed along the current shear. In this case, we obtain results that display bright (due to convergence) and dark (divergence) NRCS anomalies of equal magnitude. Adding a sea surface temperature front to this case, that alters the surface stress, the NRCS profiles exhibit both delta-like and step-like changes. From the 1-D profile of the NRCS, it is therefore possible to distinguish surface roughness modulations due to currents only (e.g., the pure convergence associated with an internal wave case) from those resulting from both current and sea surface temperature changes (meandering fronts).

By combining the new RIM with surface current fields from state-of-the-art ocean models, we further simulated the 2-D radar image manifestations of mesoscale fronts and eddies. The comparison with ERS-1 SAR and Envisat ASAR images for the case of eddies and meanders from the NCC is very promising. In particular, it is concluded that:

- the forward simulations consistently emphasize the crucial role of current convergence and divergence that occur along meandering fronts and eddies;
- in the case of convergence, the surface roughness modulation comes from the (direct and indirect) effects of the breaking of intermediate scale waves that takes place within the converging zone due to wave-current interaction;
- in the presence of surfactants, efficient accumulation within the surface convergence zone can cause wave damping and suppression of the NRCS;
- a pure shear current leads to no detectable departure from the background surface roughness and NRCS unless it meanders;
- the RIM includes the dominant interactive processes and their subsequent modulations of the surface roughness.

More evaluations are certainly needed to consolidate these results. However, the consistent approach in the RIM can potentially enable the use of multiple sources of surface information, including 3D ocean models, atmospheric forcing fields, different satellite sensor wavelength and polarization characteristics, as well as *in-situ* devices (like for instance HF radars). Note also that a growing number of experimental SAR satellites are planned to be launched within the next few years (e.g. TerraSAR X, COSMO-Skymed) that will complement the currently operating C-band Radarsat and Envisat ASAR. Future work shall also be directed towards the combination of this approach with the Doppler centroid information retrieved in SAR systems (e.g. Chapron et al., 2004; Kerbaol and Collard, 2004). Overall, we therefore conclude that

these promising results will open new opportunities for more systematic studies of mesoscale ocean variability based on SAR in the coming years.

# Acknowledgement

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# FIGURE CAPTION

Figure 1. Schematic illustration of the main radar imaging model assumptions and principles. Note that the sea surface roughness is an integral from the large scale tilt that determines mean square slope (mss) and breaking waves (wb) to the small scale Bragg (br) wavelengths. The three terms that contribute to the normalized radar cross-section (NRCS) are quasi-specular contribution  $\sigma_{sp}$ , impact from breaking waves  $\sigma_{wb}$ , and Bragg scattering  $\sigma_{br}$ 

**Figure 2.** Model response for the convergent front in  $x_1$ -direction. a) Current velocity component perpendicular to the front (solid line); current divergence (dashed line). b) NRCS contrasts for C-band at 20 ° incidence angle, VV (solid) and HH (dashed) polarizations for down-wind radar look direction. c) Same as (b) but for cross-wind radar look direction. d) Relative contribution to the contrasts for white caps coverage (solid), mean square slope (dashed) and Bragg waves spectrum (dotted-dashed). e) Same as for (b) but for 40 ° incidence angle. f) Same as (e) but for cross-wind radar look direction.

**Figure 3.** Model response for the meandering shear current front in  $x_1$ -direction. a) Current velocity component perpendicular to the front (solid line); current divergence (dashed line). b) NRCS contrasts for C-band at 20° incidence angle, VV (solid) and HH (dashed) polarizations for down-wind radar look direction. c) Same as (b) but for

cross-wind radar look direction. d) Relative contribution to the contrasts for white caps coverage (solid), mean square slope (dashed) and Bragg waves spectrum (dotted-dashed). e) Same as for (b) but for 40 ° incidence angle. f) Same as (e) but for cross-wind radar look direction.

**Figure 4.** Model response for the meandering shear current front accompanied by a sea surface temperature front. a) Current velocity component perpendicular to the front (solid line); current divergence (dashed line). b) NRCS contrasts for C-band at 20 ° incidence angle, VV (solid) and HH (dashed) polarizations for down-wind radar look direction. c) Same as (b) but for cross-wind radar look direction. d) Relative contribution to the contrasts for white caps coverage (solid), mean square slope (dashed) and Bragg waves spectrum (dotted-dashed). e) Same as for (b) but for 40 ° incidence angle. f) Same as (e) but for cross-wind radar look direction.

**Figure 5.** (a) Photograph of a spiral eddy street in the Mediterranean Sea off the coast of the Egyptian/Libyan border depicted via sun-glitter (Scully-Power, 1986). The diameter of the eddies is roughly 10 km. (b) ERS-1 SAR image of 10 km spiral eddy in the Norwegian Coastal Current manifested via film induced damping of the short Bragg waves. In this SAR image the maximum/minimum radar cross-section (in dB) was reported to be –9.5/-25 (Johannessen et al., 1996).

**Figure 6.** (a) ERS-1 SAR image expression of 10 km cyclonic eddy feature in the Norwegian Coastal Current; (b) modeled spiral eddies as traced out by passive floats

and the surface velocity field; (c) corresponding surface divergence field; (d) simulated radar cross section using the modeled current field (Fig. 6 (b)) as input.

**Figure 7.** The relative importance of specular (a), wave breaking (b) and Bragg scattering (c) to the total normalized radar cross section (d).

**Figure 8.** NRCS contrasts for the eddy current field in presence of surfactants. Wind speed 5 m/s (a) and 15 m/s (b). Radar geometry is as for ERS SAR.

**Figure 9**. (a) General surface circulation pattern and sea surface temperature structure of the modeled NCC. (b) Magnitude of the surface current in (a) with maximum speed up to 0.9 m/s. The color scales are, respectively, the sea surface temperature in °C (a) and the current magnitude in m/s (b).

**Figure 10.** Comparison of modeled surface current divergence (a) and simulated NRCS (b) using the radar imaging model (Part1).

**Figure 11.** ASAR image (a) of the Norwegian Coastal Current off southwest coast of Norway on 9 May 2003. The corresponding simulated surface current vector map (b), divergence map (c) and simulated NRCS (HH) (d). The ASAR image is oriented along

the descending flight track of the satellite and thus slightly skewed versus the model north-south orientation.

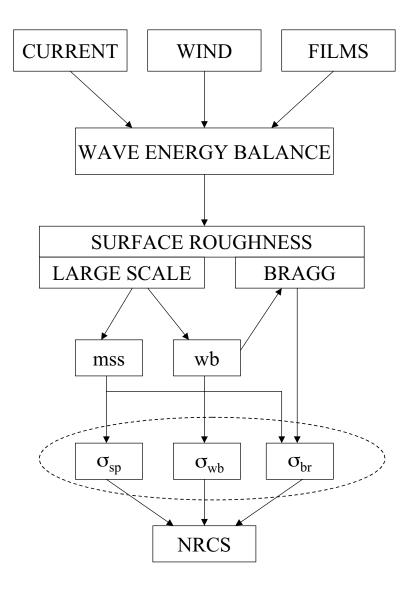


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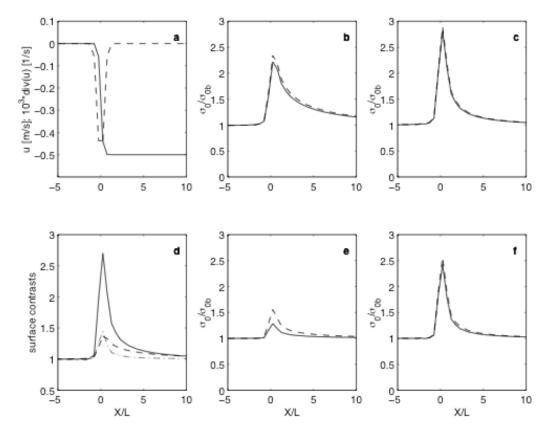


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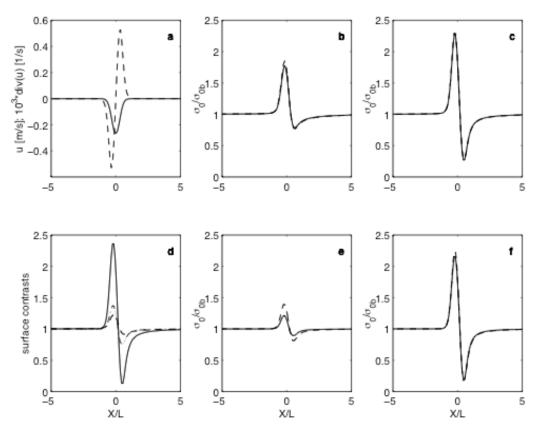


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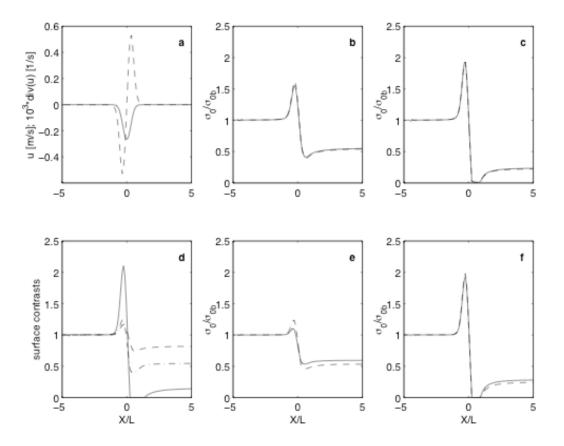


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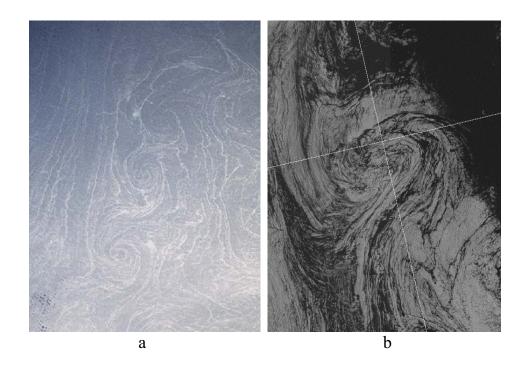


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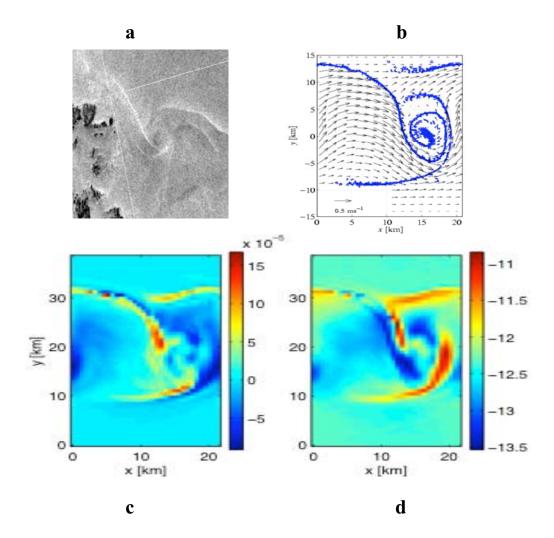


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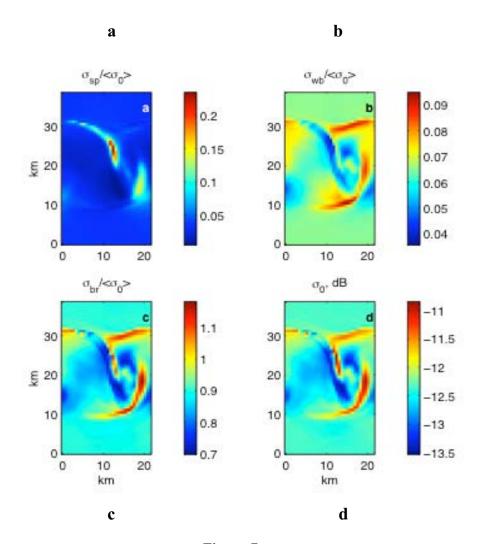


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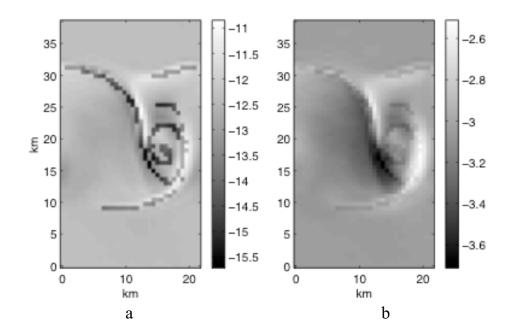


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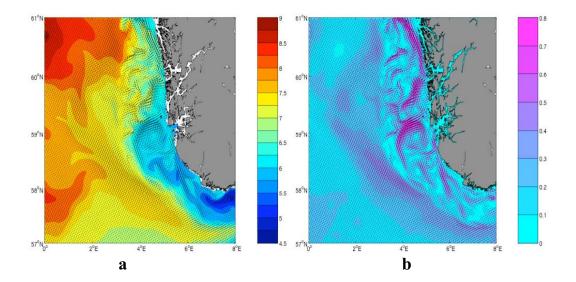


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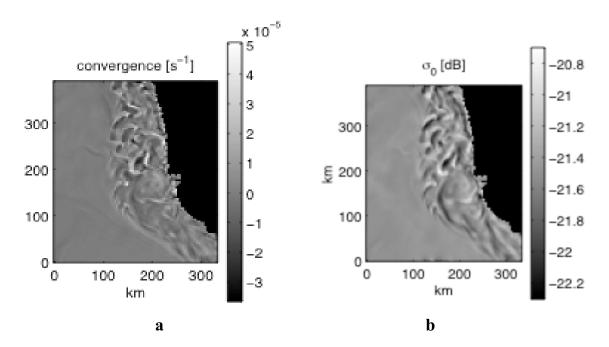


Figure 10.

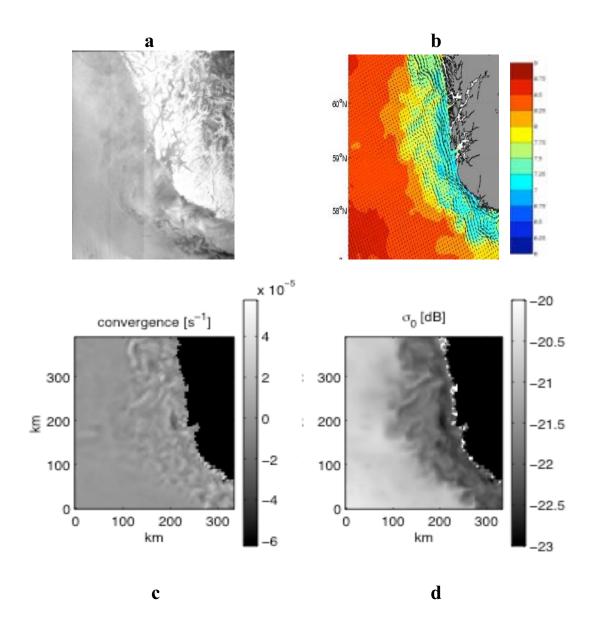


Figure 11.