# Monitoring South Florida Wetlands Using ERS-1 SAR Imagery

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# Abstract

This study evaluates the utility of synthetic aperture radar (SAR) imagery collected by the ERS-1 satellite for monitoring wetland vegetation communities in southwestern Florida. Two images were analyzed, one collected at the end of the dry season in April 1994 and one collected at the end of the wet season in October 1994. The range of image intensity values from the different test sites varied by a factor of 6.2 (7.9 dB) on the dry season ERS-1 SAR image and by a factor of 2.6 (4.1 dB) for the wet season ERS-1 SAR image. The results from the radar observations were found to be consistent with theoretical microwave scattering models that predict variations in backscatter as a function of vegetation structure, soil moisture, surface roughness, and the presence or absence of standing water. Both the radar data and models show that, in wetlands dominated by herbaceous vegetation, the presence of standing water results in a decrease in backscatter. Conversely, in wetlands with woody plants (trees and shrubs), the radar data and models show that the presence of water results in an increase in backscatter. The results of this study illustrate that radar imagery is uniquely suited to detect and monitor changes in soil moisture, flooding, and aboveground biomass in these wetland ecosystems.

## Introduction

Wetland ecosystems represent an important natural resource and provide benefits to the environment in several ways. Wetlands provide (1) natural filtering systems for purification of water; (2) breeding sites for a variety of insect, amphibian, fish, and animal species; and (3) natural buffers to floods and shoreline erosion. Between 1780 and 1980 the conterminous U.S. lost 53 percent of its wetlands mainly due to land conversion (Dahl, 1990).

Remote sensing techniques are widely used to map and monitor wetlands. Aerial photography is commonly used for the discrimination of different vegetation types within wetlands, (Shima et al., 1976; Howland 1980; Niedzwiedz and Batie, 1984). Because of the high level of specificity required about location and vegetation classification, the National Wetland Inventory uses manual interpretation of low-altitude, false-color infrared aerial photography as a basis for their wetland maps (U.S. Fish & Wildlife Service, 1990; 1994). In contrast, the NOAA Coastal Change Analysis Program and others have developed approaches to use Landsat imagery from the visible and near-infrared regions of the electromagnetic spectrum to automatically classify and map wetlands and wetland change (Dobson et al., 1995a; Jensen et al., 1993; Jensen et al., 1995; Rutchey and Vilcheck 1994). Digital multiband data in the visible and near-infrared region of the electromagnetic spectrum also offer the potential to develop quantitative estimates of wetland biomass (Hardisky

*et al.*, 1984). The efficacy of satellite data is improved significantly if they are combined with other sources of spatial information in geographic information systems (Federal Geographic Data Committee, 1992).

Recent launches of several spaceborne imaging radar systems (ERS-1 in 1991, ERS-2 in 1995, JERS-1 in 1992, and Radarsat in 1995) provide new spaceborne sources of data for monitoring wetlands. Information available from imaging radars is inherently different than that derived from other satellite systems such as the Landsat, SPOT, and IRS sensors which operate in the visible and near-infrared regions of the electromagnetic spectrum.

Imaging radars have three characteristics which make them unique. First, the microwave energy transmitted by radars to a large extent penetrates the vegetation canopy, and much of the backscattered energy detected by radars is a result of electromagnetic interactions at the ground layer. Second, the reflection of microwave energy from vegetated terrain is highly dependent on the dielectric constant of the vegetation and surface layers. The presence or absence of water in wetlands (which has a much higher dielectric constant than dry or wet soil) significantly alters the signatures detected from these areas. A third important characteristic of imaging radars is their ability to operate independent of cloud cover and solar illumination. These systems can collect imagery during periods of rain and cloud cover, and therefore can monitor wetlands throughout periods when significant levels of precipitation are affecting water levels and vegetation growth patterns. These are capabilities not available with visible and near-infrared spectrum sensors.

The goal of the research presented in this paper was to evaluate the utility of imagery collected by the ERS-1 synthetic aperture radar (SAR) for monitoring the hydrologic state (e.g., the presence or absence of water) of wetland ecosystems located in southwestern Florida. The ERS-1 SAR is a C-band system (5.7-cm wavelength) which transmits and receives vertically polarized microwave electromagnetic energy. To achieve the goal of the study, two objectives were addressed: (1) to determine if there are differences in backscatter in different wetland ecosystems in ERS-1 data collected during the wet and dry seasons; and (2) to determine if the observed differences in backscatter matched those predicted by theoretical microwave scattering models.

This paper is organized in six sections, including this introduction. The next section presents basic formulations describing microwave scattering from vegetated surfaces. These formulations are used to illustrate how the presence or absence of surface water in wetlands affects the signatures de-

Photogrammetric Engineering & Remote Sensing, Vol. 63, No. 3, March 1997, pp. 281–291.

<sup>0099-1112/97/6303-281\$3.00/0</sup> © 1997 American Society for Photogrammetry and Remote Sensing

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tected by the ERS-1 SAR in the third section. The fourth section summarizes the technical approach, including a description of the test sites and the data sets and data analysis methods used in this study. The fifth section presents the results, and the final section the conclusions.

# Radar Imaging of Vegetated Surfaces

Understanding the capabilities of imaging radars to map wetland ecosystems requires a basic knowledge of microwave scattering from vegetated surfaces. The fundamental characteristic recorded on a radar image is the spatial variation in the radar scattering coefficient,  $\sigma^{\circ}$ . To understand radar scattering from complex vegetation covers, it is necessary to think in terms of the different canopy layers affecting the radar signature. For wetlands containing shrubs and trees, there are three distinct layers to consider (Figure 1a): (1) a canopy layer which consists of small branches and foliage; (2) a trunk layer which consists of large branches and trunks or boles; and (3) a surface layer, which may or may not be covered by water.

For wetlands which do not contain woody plants, a simpler two-layer model can be used (Figure 1b): (1) a canopy layer consisting of herbaceous vegetation; and (2) a surface layer, which may or may not be covered by water.

In the interaction of microwave energy with vegetated surfaces, the canopy and trunk layers function in two distinctly different ways. First, they are direct sources of scattering of microwave energy. And second, the components of these layers absorb or attenuate microwave energy.

The total radar scattering coefficient from woody vegetation,  $\sigma_{t-w}^{\circ}$ , can be expressed after Wang *et al.* (1994; 1995a) and Dobson *et al.* (1995b) as

$$\sigma^{\circ}_{t-w} = \sigma^{\circ}_{c} + \tau^{2}_{c} \tau^{2}_{t} \left(\sigma^{\circ}_{m} + \sigma^{\circ}_{t} \sigma^{\circ}_{s} + \sigma^{\circ}_{d}\right)$$
(1)

where

- $\sigma_{c}^{\circ}$  is the backscatter coefficient of the crown layer of smaller woody branches and foliage,
- $\tau_c$  is the transmission coefficient of the vegetation canopy,
- $\tau_t$  is the transmission coefficient of the trunk layer,
- $\sigma^{\circ}_{m}$  is multiple-path scattering between the ground and canopy layer,
- $\sigma^{\circ}_{t}$  is direct scattering from the tree trunks,
- $\sigma_{s}^{\circ}$  is direct surface backscatter from the ground, and
- $\sigma^{\circ_{\vec{d}}}_{d}$  is double-bounce scattering between the trunks and ground.

In terms of the total radar scattering coefficient from wetlands with non-woody, herbaceous vegetation,  $\sigma_{t-h}^{\circ}$ , by eliminating all terms pertaining to the trunk layer, Equation 1 can be simplified to

$$\sigma^{\circ}_{t-h} = \sigma^{\circ}_{c} + \tau^{2}_{c} \left( \sigma^{\circ}_{s} + \sigma^{\circ}_{m} \right).$$
<sup>(2)</sup>

The various terms in Equations 1 and 2 are not only dependent on the types of vegetation present in a wetland, but also on the wavelength and polarizations of the incident microwave radiation, and the dielectric constant of the vegetation and the ground surface. The scattering and attenuation terms in Equations 1 and 2 are all directly proportional to the dielectric constant. Live vegetation, with a higher water content, has a higher dielectric constant than drier, dead vegetation. The presence of dew or moisture from rainfall acts to increase the dielectric constant of vegetation surfaces.

The condition of the ground layer is very important in microwave scattering from vegetated surfaces. There are two properties of this layer which are important: the RMS surface roughness (relative to the radar wavelength) and the reflection coefficient. In general, a greater RMS surface roughness (1) increases the amount of microwave energy backscattered (increasing  $\sigma_s^{\circ}$ ) and (2) decreases the amount of energy scat-



Figure 1. Schematic drawing of major sources of scattering from vegetation canopies ( $\sigma_c^{\circ}$  = canopy backscatter;  $\sigma_d^{\circ}$  = ground-trunk backscatter;  $\sigma_m^{\circ}$  = ground-canopy backscatter;  $\sigma_s^{\circ}$  = ground-surface backscatter;  $\sigma_t^{\circ}$  = direct trunk scattering).

tered in the forward direction (decreasing  $\sigma_m^{\circ}$  and  $\sigma_d^{\circ}$ ). The reflection coefficient is dependent on the dielectric constant (or conductivity) of the ground layer. A dry ground layer has a low dielectric constant and therefore has a low reflection coefficient. As soil moisture increases, so does the dielectric constant and, hence, the reflection coefficient. Given a constant RMS surface roughness, as the soil dielectric constant increases, so does both the amount of backscattered and forward scattered microwave energy (resulting in increases in  $\sigma_s^{\circ}$ ,  $\sigma_m^{\circ}$ , and  $\sigma_d^{\circ}$ ).

Finally, the presence of a layer of water over the ground surface of a vegetated landscape has two results: (1) it eliminates virtually any RMS surface roughness and (2) it significantly increases the reflection coefficient. In terms of microwave scattering: (1) the elimination of any RMS surface roughness means that all the energy is forward scattered, eliminating the surface backscattering term ( $\sigma_s$ ) in Equations 1 and 2; and (2) the increased forward scattering and higher reflection coefficient lead to significant increases in the ground-trunk and ground-canopy interaction terms ( $\sigma_d^{\circ}$  and  $\sigma_m^{\circ}$ , respectively).

The approaches used to actually calculate the various terms in Equations 1 and 2 are quite complex and beyond the scope of this paper. Those desiring a more theoretical description of microwave scattering from vegetated surfaces are referred to Wang *et al.* (1994; 1995a; 1995b).

## Monitoring Wetlands Using ERS-1 SAR Imagery

The relative strength of the increase or decrease in  $\sigma^{\circ}$  when surface water is present or absent is dependent on both scene and radar system parameters. In general, the presence of water under a plant canopy increases radar backscatter from wetlands with woody vegetation and decreases radar backscatter from wetlands with non-woody (herbaceous) vegetation. In this section, the effects of variations in surface (vegetation and ground-layer) conditions on the radar backscatter detected by the ERS-1 SAR are illustrated through presentation of results from theoretical backscatter models and results from previous studies of wetland ecosystems.

#### Wetlands with Non-Woody Vegetation

Tanis *et al.* (1994) studied multi-temporal ERS-1 SAR imagery collected over tidally inundated salt marshes in the St. Marks National Wildlife Refuge, Florida. This wildlife refuge is located on the gulf coast of northern Florida, just south of Tallahassee. The vegetation of many of the non-woody wetlands in this salt marsh is similar to that found in the test sites of southwest Florida used in this study.

Analysis of multi-date ERS-1 SAR imagery by Tanis et al. (1994) showed that on average the radar scattering coefficient from a marsh dominated by black rush (Juncus roemerianus) was 4 to 6 dB brighter during low tide than at high tide. During low tide, the soil was exposed (not covered by water) and had high soil moisture conditions. Figure 2 (after Dobson et al., 1995c) illustrates the effects of variations in aboveground biomass, soil moisture, and flooding on the predicted radar scattering coefficient for the ERS-1 SAR data collected over the St. Marks test site. These plots were generated to determine if the observations made by Tanis et al. (1994) were consistent with microwave scattering theory. Although no field measurements on aboveground biomass were collected coincident with the ERS-1 SAR data, a reasonable estimate for aboveground biomass in the salt marsh is between 1 and 2 kg m<sup>-2</sup>. The observed 4- to 6-dB difference in SAR backscatter between a flooded and non-flooded condition is consistent with the model predictions.

The modeling (Figure 2) by Dobson et al. (1995) and the ERS-1 SAR observations by Tanis et al. (1994) indicate that the dominant scattering mechanism in wetlands with vertically oriented, low biomass, herbaceous vegetation is surface scattering ( $\sigma_{sb}^{\circ}$ ). Increases in biomass have two effects on the radar signature: First, the increases in biomass attenuate the surface return (lower  $\tau_{a}$ ); and second, increases in biomass result in increases in canopy and multi-path scattering ( $\sigma_e^{\circ}$ and  $\sigma^{\circ}_{m}$ , respectively). Because predicted backscatter decreases as biomass increases for any level of soil moisture (Figure 2), one concludes that the effects of the attenuation of surface backscatter are greater than the effects of increases in backscatter from vegetation when no surface water is present. Many of the test sites used in this study contained vertically oriented, herbaceous (non-woody) vegetation. For these sites, the radar backscatter recorded on ERS-1 SAR should behave in a similar fashion to the St. Mark's site in response to the presence or absence of water under the vegetation canopy.

#### Wetlands with Woody Vegetation

There is a growing consensus within the microwave remote sensing community that shorter wavelength (< 10 cm) radar systems are not useful for monitoring flooding in forested landscapes (Hess *et al.*, 1990). In particular, through the use of theoretical models, Wang *et al.* (1995b) showed that Cband radars should not be useful for detecting flooding in the dense forest canopies found in the Brazilian Amazon. This theory was confirmed by Hess *et al.* (1995) using NASA's Shuttle Imaging Radar-C. However, Ustin *et al.* (1991) present evidence that shorter wavelength radar systems (3 and 6 cm) are able to detect flooding in forests in the winter and spring when no foliage is present. In addition, as illustrated below, in situations where there are low amounts of woody



biomass, differences in soil moisture and the presence of surface water result in distinct variations in the radar scattering coefficient predicted by a theoretical backscattering model for the ERS-1 SAR.

Figure 3 illustrates the effects of variations in soil moisture and flooding on  $\sigma^{\circ}$  for a loblolly pine forest, assuming an RMS surface roughness of 1 cm. The calculations on the effects of surface moisture are from Wang *et al.* (1994), while the calculations for flooding were specifically produced for this study (using the model inputs on canopy structure and dielectrics developed by Wang *et al.* (1994)) in order to determine if ERS-1 is sensitive to these effects at lower biomass levels. Figure 3a illustrates that total backscatter increases as a function of soil moisture for all biomass levels. When a layer of water is present over the forest ground layer, total backscatter increases proportionally to total biomass relative to the dry soil case.

The model predictions in Figure 3b show that surface backscatter is quite sensitive to both variations in soil moisture and total biomass. As biomass increases, the surface backscatter decreases because of increased attenuation by the canopy and trunk layers. In contrast, the model predictions in Figure 3c show that an increase in biomass should enhance the double-bounce scattering.

With respect to the present study, the above observations are important because several of the periodically flooded sites in the study area contain woody vegetation. In those sites where the aboveground biomass is low, one would expect variations in soil moisture or flooding to have a noticeable effect on the ERS-1 radar signatures, as illustrated in the modeling results from the loblolly pine forest. In those sites with high biomass, one would expect that flooding would have little or no effect on the radar signature, except possibly in the cypress test sites during the winter when no foliage is present.



Figure 3. Model predictions on the effects of variations in soil moisture, flooding, and aboveground biomass on ERS-1 SAR backscatter in a young loblolly pine forest. (a) Total backscatter. (b) Relative contribution of surface backscatter ( $\sigma_s^{\circ}$ ). (c) Relative contribution of ground-trunk backscatter ( $\sigma_o^{\circ}$ ).

# **Experimental Approach**

# Study Site

The test site for this study is a region of southwestern Florida located immediately south of the east-west line connecting Naples and Fort Lauderdale (Figure 4). This region contains numerous wetland ecosystems. It has a subtropical climate, with a distinct wet season in the summer and early fall and a dry season from October through April or May. The average annual precipitation for this region is approximately 140 cm, with 60 percent falling between June and September. The shallow aquifers in the study area quickly saturate during the rainy season; therefore, most of the water is drained from the land through overland flow.

This study focused on ten different vegetation cover types common to this region. Photos of all sites except the Dwarf Cypress are presented in Figure 5. Because the Dwarf Cypress Site was in a remote location, it was not possible to obtain a surface photograph. The sites were located within areas which were relatively undisturbed (e.g., the western portion of the Big Cypress National Preserve, the Fakahatchee Strand Preserve (state), and the Collier Seminole State Park), as well as areas which have undergone heavy human disturbance over the past two decades. The disturbed sites were located in an area called the South Golden Gate Estates Development. An extensive road and canal network had been established in this region in the early 1970s with the intent of developing home sites. The natural drainage patterns have been significantly altered in this region, and even though flooding does occur in some areas during the rainy season, the sites in this area are typically more well drained during the dry season.

The test sites used in this study included

- An undisturbed brackish marsh dominated by black rush (Juncus roemerianus);
- (2) An undisturbed wet prairie dominated by sawgrass (Cladium jamaicense);
- (3) A disturbed wet prairie dominated by grasses and other low stature herbaceous vegetation with sandy soils that dry completely during the dry season and become flooded only during extremely wet conditions (this site is referred to as the sand wet prairie);
- (4) An undisturbed wet prairie dominated by grasses and other low stature herbaceous vegetation with a marl soil, which remains fairly moist even during the dry season and floods during the wet season (this site is referred to as the marl wet prairie site);
- (5) An undisturbed cattail marsh (Typhus latifolia);
- (6) An undisturbed hydric pine flatland which has an open canopy of slash pine (*Pinus elliottii*) with low shrubs and a ground layer of grasses and other herbaceous plants;
- (7) A relatively undisturbed, mixed-hardwood swamp forest which was once dominated by cypress (*Taxodium distichum* L), but after logging, other hardwood species have invaded these forests, including red maple (*Acer rubrum*), willow (*Salix sp.*), ash (*Fraxinus sp.*), swamp bay (*Magnolia virginiana*), and holly (*Ilex cassine*);
- (8) An undisturbed, cypress forest which remains flooded throughout most of the wet and dry seasons (hydric cypress);
- (9) A relatively undisturbed dwarf cypress forest which remains mostly flooded throughout the wet and dry seasons; and
- (10) A disturbed site dominated by shrubs and cabbage palm (Sabal palmetto). Because this site remains unflooded through both the wet and dry seasons, it is not a forested wetland. It was included to examine the effects of variations in soil moisture on an open-forest site.

# **ERS-1** Data Analysis

The ERS-1 SAR imagery used in this study were collected on 28 April 1994 during the dry season and 13 October 1994 at



the end of the wet season (Figure 6). Figure 7 presents a twoscene ERS-1 image mosaic from data collected in October which shows the locations of the test sites used in this study. Radiometric calibration of the ERS-1 SAR data consisted of antenna pattern removal, range fall-off correction, and incidence angle correction. Absolute calibration was not possible due to lack of precision calibration targets within the scene. As an alternative, the 28 April 1994 ERS-1 image was normalized to the 13 October 1994 image scene. This normalization process was performed by assuming that the radar cross section of a heavily urbanized area remained constant between scenes. The urban area selected was downtown Naples and was devoid of large water bodies and vegetation communities. Because this feature had an extremely high radar cross section, variations in the phenology of vegetation and the presence or absence of standing water on street surfaces or buildings would contribute very little to the total radar cross section of this target.

To achieve relative normalization or between-scene calibration, the images were first georeferenced to each other. Next, an average (weighted) image intensity was calculated for each scene using four areas of 30 by 30 or 50 by 50 pixels in size. A scale factor was created by dividing the October weighted mean intensity by the April weighted mean intensity. Each pixel of the 12 April 1994 image was then multiplied by this calibration factor. The radar scattering coefficients obtained using this procedure are relative, not absolute. These  $\sigma^{\circ}$  values cannot be compared to other ERS-1 scenes or any other C-band SAR data.

It has been shown that the ERS-1 SAR system is extremely stable, such that an in-scene and pass-to-pass uncertainty of  $\pm$  0.5 dB can be achieved if internal and image processing

calibration coefficients are recorded (Fatland and Freeman, 1992). Because these coefficients were not available for the data used in this study, we estimate the between-scene calibration to be on the order of  $\pm$  1.5 dB.

Each test area listed in Table 1 was located on the ERS-1 SAR images. An average radar scattering coefficient was estimated for each site using a rectangle between 100 and 450 pixels in size in order to minimize the effects of radar image fading. The standard deviation of the mean in dB was calculated after Kasischke and Fowler (1989) as

$$s_x (dB) = 10 (0.188 \epsilon_x^2 + 0.472 \epsilon_x^4)^{0.5}$$
 (3)

where  $\varepsilon_x$  is the fractional coefficient of variation,  $s_x/x$ , where  $s_x$  is the sample standard deviation of the mean, x (both in linear terms).

During a preliminary phase of this study, a visit was made to many of the test sites during the week prior to the collection of the 13 October 1994 ERS-1 data collection. Because the study of the radar imagery began in the spring of 1995, we were unable to visit each site during the 28 April 1994 satellite overpass to determine the state of soil moisture and degree of flooding. Instead, the status of soil moisture or degree of flooding for each site was based upon a combination of field observations made by local scientists during 1994 as well as inference. The inferences were based on data from several sources and observations, including

• The summer and fall of 1994 and spring of 1995 had higher than normal precipitation, with the Naples region receiving 240 mm more precipitation than the average for the previous 30 years (based on data from the National Climate Data Center). Therefore, if a site was not flooded in the spring of 1995, it is highly likely it was not flooded during April of 1994.



- Scientists from the Rookery Bay National Estuarine Research Reserve (RBNERR) visited the dwarf cypress site during 1994, and attested that this site was most likely flooded during October of 1994 and was not flooded at the end of the dry season (April) in 1994.
- The cattail stand used in this study is located next to a water canal adjacent to U.S. 41. RBNERR scientists state that this site is continuously flooded.
- Water level data maintained by scientists of the Fakahatchee Strand Preserve are consistent with the water levels inferred for the mixed hydric cypress and the sawgrass prairie sites in the spring of 1994 based on the observations made in the spring of 1995.

Table 1 summarizes the expected soil moisture or flood stage for each test site.

The amount of living non-woody vegetation present at each site should vary between April and October, because April is at the beginning of the growing season while October is at the end of the growing season. Our visits in May of 1995 showed that there was significant living biomass at the cattail, juncus, and sawgrass test sites at this time, and it is not unreasonable to expect some new growth to have been present at these sites in April of 1994. There was very little new vegetation growth at the sand and marl wet prairie sites in May of 1995. We assume that similar conditions existed in April of 1994. Cattail growth peaks early in the summer in this region and begins to die back by the end of the summer. Juncus probably reaches its maximum biomass late in the summer and early in the fall. Measurements of sawgrass indicate that living biomass remains fairly constant throughout the year (Steward and Ornes, 1975), although field observations indicate sawgrass dries out somewhat during the dry season and is greener at the end of the wet season (Chris Craft, Duke University Wetland Center, personal communication).



Figure 6. ERS-1 SAR images collected during the wet (13 October 1994) and dry (28 April 1994) seasons.



Figure 7. ERS-1 SAR image mosaic of south Florida region collected on October 1994 with locations of the test sites.

TABLE 1. OBSERVED/PREDICTED SOIL MOISTURE/FLOODING STATUS OF SOUTH FLORIDA TEST SITES

Site	April 1994	October 1994
1. juncus prairie	flooded	floodeda
2. sawgrass prairie	flooded	flooded <sup>a</sup>
3. sand wet prairie	dry soil	wet soil <sup>a</sup>
4. marl wet prairie	saturated soil	flooded <sup>1</sup>
5. cattail marsh	flooded	flooded*
6. hydric pine	wet soil	flooded
7. mixed hardwood swamp	flooded <sup>a</sup>	flooded
8. hydric cypress	partially flooded <sup>1</sup>	flooded <sup>a</sup>
9. dwarf cypress	partially flooded	flooded <sup>i</sup>
10. cabbage palm	dry soil	wet soil <sup>a</sup>

status of water level derived from actual observations status of water level derived from inference

# Results

In interpreting the results from this study, the limitations of the experimental design need to be acknowledged. First and foremost is the lack of coincident ground-truth for the April 1994 image. Second, while the sizes of the individual test sites were large, it would be desirable to have several more replicates for each cover type in order to determine the degree of site-to-site variability which exists in the radar signatures. Both of these concerns are being addressed in the ongoing research in the southwest Florida region.

# Variations in Radar Cross Section Values from Southwestern Florida Wetlands

Table 2 summarizes the means and standard deviations of the radar scattering coefficients ( $\sigma^{\circ}$  values)<sup>1</sup> for the ten different vegetation cover types used in this study. Table 3 summarizes the range and average  $\sigma^{\circ}$  values for all test sites, as well as for all herbaceous wetlands and all wooded wetlands (excluding the cabbage palm site). Figure 8 presents a comparison of the relative  $\sigma^{\circ}$  values derived for the different test sites on the two different dates. Figure 8a presents data for the non-woody vegetation sites while Figure 8b presents data for the test sites which contained trees (woody sites). In these plots, the x-axis presents the  $\sigma^{\circ}$  values for the dry season (April 1994) while the y-axis presents the estimated change in the  $\sigma^{\circ}$  values between April and October (a positive value indicates an increase in backscatter between April and October while a negative value represents decrease in backscatter).

Overall, the average  $\sigma^{\circ}$  values are higher for the wooded wetlands than they are for the herbaceous wetlands in both April and October. While the presence of water on the ground surface during the wet season increases the overall radar backscatter for all sites, for some of the herbaceous

wetlands the backscatter actually decreases (Figure 8b). The range of  $\sigma^{\circ}$  values for the various test sites was greater during the dry season than during the wet season, particularly for the non-wooded wetland sites. The range of  $\sigma^{\circ}$  values obtained during the late dry season (April) varies by a factor of 6.2 (7.9 dB). At this time, the range of  $\sigma^{\circ}$  values is far greater for the herbaceous wetlands than for the wooded test sites [a factor of 5.1 or 7.1 dB for herbaceous communities versus 1.6 (2.0 dB) for wooded test sites]. During the late wet season, the range in  $\sigma^{\circ}$  values drops to a factor of 2.6 (4.1 dB) overall. While the range of values is still larger in the nonwooded wetlands, the overall range has dropped significantly [a factor of 1.6 (2.0 dB) for non-woody wetlands and 1.4 (1.5 dB) for the wooded sites]. Therefore, in terms of using single-date ERS-1 data for vegetation discrimination, it appears that dry-season ERS-1 SAR data are more preferable than wet season imagery.

# Wetland Vegetation Mapping Using Multi-Date ERS-1 Imagery

Plate 1 presents a false-color composite image generated from ERS-1 SAR imagery collected on 28 April and 13 October 1994 over the test site. The October 1994 image from the wet season is displayed in red and the April 1994 image from the dry season in cyan. This two-date composite shows the seasonal differences in the wetland vegetation of southwestern Florida. The cyan regions of the composite are areas of low return in October. These are likely communities with short herbaceous vegetation which will produce specular reflection in the wet season when the water levels are high. The various red-shaded regions are vegetation with denser canopies, from agriculture to forest. The brighter-red areas are likely flooded vegetation, while the reddish-brown regions are nonflooded. Plate 1 illustrates that false-color images created from multi-date ERS-1 SAR can aid in the discrimination of different wetland communities.

## Comparison of Observations with Theory - Non-Wooded Wetlands

In April of 1994, the lowest  $\sigma^{\circ}$  value was obtained for the sand wet prairie site, and the highest for the marl wet prairie site. The low  $\sigma^{\circ}$  at the sand wet prairie site is the result of a combination of a low dielectric constant and smooth ground surface, which combine to result in a low surface scattering term ( $\sigma^{\circ}_{,}$  in Equation 2). The marl wet prairie site had the highest radar backscatter because of a relatively rough surface (from rocks and limestone deposits at the surface) and a water-saturated, but not flooded, soil surface, resulting in higher surface scattering (  $\sigma^\circ_{\,\rm s}$  ) in Equation 2. Both of these sites had a relatively low amount of living vegetation to attenuate  $(\tau_c)$  the surface signature. As expected from microwave scattering theory, the flooded sites (cattail, juncus, sawgrass) have lower  $\sigma^{\circ}$  values than the marl wet prairie site with high soil moisture because the presence of surface water eliminates the surface scattering term ( $\sigma^{\circ}_{s}$ ) in Equation 2.

<sup>1</sup>The  $\sigma^{\circ}$  values are expressed in dB or 10 log [intensity].

TABLE 2. RELATIVE ERS-1 RADAR BACKSCATTER VALUES FOR SOUTHWEST FLORIDA TEST SITES

Site	Sample Size (pixels)	April 1994 ERS-1 Backscatter Mean (dB)	Standard Deviation	October 1994 ERS-1 Backscatter Mean (dB)	Standard Deviation
1. juncus salt marsh	100	-11.9	1.4	-10.5	1.4
2. sawgrass prairie	200	-11.7	1.3	-9.4	1.4
3. sand wet prairie	100	-16.4	2.4	-11.3	1.8
4. marl wet prairie	100	-9.3	1.4	-11.0	1.9
5. cattail marsh	100	-10.9	1.4	-11.4	1.9
6. hydric pine	100	-10.5	1.4	-8.7	1.4
7. mixed hardwood swamp	400	-8.5	1.4	-7.5	1.2
8. hydric cypress	175	-9.2	1.4	-7.9	1.4
9. dwarf cypress	450	-9.5	1.5	-7.3	1.2
10. cabbage palm	350	-14.0	1.6	-10.0	1.4

TABLE 3. RANGES OF BACKSCATTER VALUES OBSERVED FOR SOUTHWEST FLORIDA WETLAND TEST SITES

Sites	April High	Low	Range	Average	October High	Low	Range	Average
all	-8.5 dB	-16.4 dB	7.9 dB	-10.4 dB	-7.3 dB	-11.4 dB	4.1 dB	-9.2 dB
herbaceous	-9.3 dB	-16.4 dB	7.1 dB	-11.5 dB	-9.4  dB	-11.4 dB	2.0 dB	-10.6 dB
woody	-8.5  dB	-10.5 dB	2.0 dB	-9.4 dB	-7.3 dB	-8.7 dB	1.4 dB	-7.8 dB

These sites have a greater  $\sigma^{\circ}$  than the sand wet prairie because the scattering from the vegetation canopy  $(\sigma_{c}^{\circ})$  is larger due to higher biomass levels.

The change in radar backscatter at the non-woody vegetation sites between April and October (Figure 8a) are entirely consistent with the predictions of the theoretical model of Dobson *et al.* (1995c). The  $\sigma^{\circ}$  values from the marl wet prairie site decrease because flooding eliminates direct radar backscattering ( $\sigma_s^{\circ}$ ) from the moist surface layer. The sand wet prairie site increases in radar backscatter because increases in soil moisture results in higher direct surface scattering ( $\sigma_s^{\circ}$  in Equation 2). While the difference in the cattail site is small (-0.5 dB or 12 percent lower) and probably not statistically significant, it is in the direction one would ex-



Figure 8. Plots of ERS-1 SAR backscatter in April 1994 versus change in backscatter between April and October of 1994. (a) Non-woody (herbaceous) vegetation. (b) Woody vegetation. pect at a flooded site with decreasing vegetation biomass (e.g., lower canopy scattering,  $\sigma_c$ ). The increased radar backscatter at the sawgrass and juncus sites is consistent with increases in living biomass for flooded vegetation which leads to increased canopy scattering. The sawgrass has a higher standing crop; therefore, this site should have a larger increase, which it does.

#### Comparison of Observations with Theory - Wooded Wetlands

The wooded wetland vegetation sites are all responding as predicted by the generalized microwave scattering models presented in Equation 1. The cabbage palm site has the lowest  $\sigma^{\circ}$  value in the dry season image (April) because of the open canopy, low tree density, and, most importantly, low soil moisture. The increased soil moisture in October results in more surface scattering ( $\sigma^{\circ}_{s}$  in Equation 1) as well as increased multipath scattering ( $\sigma^{\circ}_{d}$  and  $\sigma^{\circ}_{m}$ ), both of which lead to the observed 4 dB increase in the  $\sigma^{\circ}$ .

The highest  $\sigma^{\circ}$  value in April was obtained for the mixed hardwood swamp site, most likely due to the fact that this site had the highest biomass density of all the forested sites, which leads to high canopy scattering ( $\sigma_c^{\circ}$ ). The 1 dB increase in  $\sigma^{\circ}$  between April and October is within the error bound ( $\pm$  1.5 dB) for between-scene calibration and therefore may not be significant; however, an increase in foliar biomass in the tree canopy would be expected to increase direct canopy scattering ( $\sigma_c^{\circ}$ ).

The dwarf cypress and hydric cypress sites would be expected to have higher  $\sigma^{\circ}$  values in April than would the other wooded sites (cabbage palm and hydric pine) due to several factors. First, the presence of moist or flooded soils and low canopy density at these sites leads to higher multipath scattering ( $\sigma_{d}^{\circ}$  and  $\sigma_{m}^{\circ}$ ) than at the cabbage palm and hydric pine sites. Second, the lower tree density results in a lower attenuation by the canopy  $(\tau_c)$  and trunk layers  $(\tau_t)$  of direct surface scattering ( $\sigma^{\circ}_{s}$ ) and multiple path scattering  $(\sigma^{\circ}_{d} \text{ and } \sigma^{\circ}_{m})$ . Increases in the amount of flooding between April and October would be expected to increase radar backscatter at all the woody vegetation sites except the mixed hardwood forests. The higher backscatter would be expected from increases in the multipath trunk scattering terms ( $\sigma_d^{\circ}$ and  $\sigma_{m}^{\circ}$ ) in Equation 1. Significant increases (greater than 1.5 dB) were observed for the dwarf cypress and hydric pine sites.

## Conclusions

In this paper, the results of a study evaluating the utility of spaceborne SAR data to monitor wetland ecosystems in southern Florida are presented. Although this study had limitations in terms of coincident field truth and number of replicates per vegetation type, the results demonstrate that the imagery collected by the ERS-1 SAR (a single frequency and single polarization radar) is sensitive to a wide range of factors which change during the growing season and between wet and dry seasons in these ecosystems. The results of this study also show that data from this radar system has the potential to discriminate between different vegetation communities based upon canopy structure, soil moisture, the presence or absence of flooding, and vegetation growth.



Through the use of theoretical radar scattering models, it is known that all of these factors are important in scattering from vegetated surfaces. The changes observed between the dry and wet season ERS-1 images in different wetland vegetation covers in the south Florida region are quite dramatic, and are entirely consistent with microwave scattering theory.

Within the radar remote sensing community, there has been a tendency to overlook the utility of single-frequency, single-polarization radars for monitoring vegetated surfaces (Evans et al., 1995). This tendency is largely an outgrowth of research over the past decade which has focused on multichannel airborne SAR data, and the programmatic desire in some quarters to promote an advanced satellite system containing a similar multi-channel SAR. In addition, the current generation of spaceborne SARs such as ERS-1 and Radarsat were designed primarily to monitor the polar oceans; therefore, their radar frequencies and polarizations were not optimized to monitor vegetated surfaces. In spite of these limitations, this study and others focusing on the multi-temporal capabilities have shown a wider degree of applications of these data than previously anticipated (Kasischke et al., 1995; Kasischke et al., 1996).

The preliminary results of this ongoing study demonstrate the usefulness of SAR in monitoring wetland ecosystems. Microwave backscatter from vegetated surfaces is sensitive to both variations in soil moisture and the presence or absence of surface water. Optical and thermal sensors are less sensitive to these factors and cannot be used to directly monitor soil moisture or flooding unless the canopies are open enough to allow direct detection of the water or ground surface. What makes radar systems particularly useful is that they are not affected by cloud cover, and thus can routinely collect imagery throughout the rainy season. These capabilities offer the opportunity to monitor wetland ecosystems on a continuous basis, something which is not possible using Landsat or SPOT, which operate in the visible and infrared region of the electromagnetic spectrum.

Mapping and monitoring wetlands presents a challenge to scientists and resource managers. Remote sensing techniques developed to date are based primarily on detection of vegetation cover and patterns which are unique to wetland ecosystems. Imaging radars present a new tool for this purpose. In many instances, these systems can directly detect those factors which are responsible for the creation of wetlands, e.g., saturated soils and/or periods of flooding or inundation.

## Acknowledgments

The research reported in this paper was supported through a grant from the National Oceanic and Atmospheric Association. The ERS-1 SAR imagery used in this study was provided by the European Space Agency under Experiment AO2.USA135. The authors would like to thank Michael Shirley and his colleagues at the Rookery Bay National Estuarine Research Reserve and the Florida State Department of Environmental Protection for their support in identifying the test sites used in this study, as well as providing ongoing logistical support and advice to this project. The authors would also like to thank Craig Dobson of the University of Michigan for providing Figure 2.

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- (Received 13 November 1995; revised and accepted 12 August 1996; revised 11 September 1996)

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