

## Evaluation of salinity intrusion in arable lands of Al-Batinah coastal belt using unmanned aerial vehicle (UAV) color imagery

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### تقييم تسرب الملوحة في الحزام الزراعي في ساحل الباطنة باستخدام الصور الملونة الملتقطة من طائرة بدون طيار

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**ABSTRACT.** Salinity by seawater intrusion due to excess groundwater pumping for irrigation is a major environmental challenge in the coastal areas of the Sultanate of Oman. Increasing salinity levels moving inward the arable lands is happening in a rapid manner. Thus, salinity needs to be evaluated and quantified using a fast and accurate method. The objective of this study was to estimate salinity intrusion in Al-Batinah coastal belt using color aerial imaging. The study was conducted in five randomly selected sites at increasing distances from the seashore of Al-Suwaik area in Al-Batinah region of northern Oman. Color aerial images were acquired for each site with an Unmanned Aerial Vehicle (UAV). Images were enhanced by orthorectification in ENVI software. A Green Leaf Index (GLI) was obtained from each site image using Matlab software. Image analysis results were compared with the results of analyzed soil and water samples taken for ground-truth verification. There was a strong negative correlation between the distance from the seashore and the soil EC of each site ( $R = -0.95$ ). Similarly, the mean value of GLI increased as the salinity levels decreased,  $R = -0.96$  and  $-0.92$  for soil EC and water EC, respectively. We demonstrated the possibility of the use of color images taken by a UAV to accurately quantify the effect of soil salination on vegetation along the coastal belt.

**KEYWORDS:** Seawater Intrusion; Salinity Dynamics; UAV; Image Processing; GLI.

**المستخلص:** تمثل الملوحة تحديًا بيئيًا كبيرًا في المناطق الساحلية في عمان. حيث أن حركة الملوحة باتجاه الأراضي الداخلية الصالحة للزراعة تسير بسرعة عالية، لذا فهناك حاجة ماسة للكشف عن حركة التملح وتقييمها باستخدام طريقة سريعة ودقيقة. الهدف من هذه الدراسة هو تقييم حركة الملوحة داخل حزام الباطنة الساحلي باستخدام تقنيات التصوير الجوي الملون. وقد أجريت الدراسة في خمسة مواقع مختارة بطريقة عشوائية تبعد بمسافات مختلفة عن شاطئ ولاية السويق. تم التقاط الصور الجوية الملونة لكل موقع بواسطة طائرة بدون طيار. وتم تحسين الصور هندسيًا كخطوة أولى في عملية تحليل الصور الجوية. ثم تم حساب مؤشر اخضرار الأوراق (GLI) المستنبط من صورة كل موقع. بعد ذلك تمت مقارنة تحاليل الصور مع تحاليل التربة والماء في عملية التحقق وربط المستنبط بالواقع. كان هناك ارتباط سلبي قوي بين المسافة من شاطئ البحر وملوحة التربة لكل موقع (معامل ارتباط  $= -0.95$ ). وبالمثل، زادت قيمة (GLI) مع انخفاض مستويات الملوحة، معامل ارتباط  $= -0.96$  وملوحة التربة ومعامل ارتباط  $= -0.92$  للملوحة المياه. أوضحت نتائج هذا العمل البحثي إمكانية استخدام الطائرات بدون طيار مثبتة بكاميرا ملونة لتقدير وتحليل تأثير البعد عن شاطئ البحر على مستويات الملوحة في التربة والمياه، وكذلك على حالة الغطاء النباتي في الأراضي الصالحة للزراعة بمنطقة الباطنة.

**الكلمات المفتاحية:** تسرب الملوحة، ديناميكية التملح، الطائرات بدون طيار، تحليل الصور، مؤشر إخضرار الأوراق

## Introduction

The Sultanate of Oman is considered as an arid country with an average annual rainfall of about 100 mm. Although agriculture occupies about 5% of the total area of Oman distributed around eleven governorates (regions), the agricultural sector consumes more than 93% of the total water demand. Al-Batinah North governorate represents the largest area of Oman's agricultural lands (Table 1) covering 24% of the total agricultural area of the country and is considered to be Oman's most important agricultural area as it produces 65% of the Omani agricultural production with crops such as dates, fruits, vegetables and forage crops such as alfalfa and Rhodes grass (Choudri et al. 2015a; Choudri et al. 2013).

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The population in Al-Batinah has sharply increased since 2003: i.e. by more than 100,000 people within 7 years. Subsequently, the socioeconomic activities; active ports, coastal tourism projects, industrial activities, infrastructure development, intensive agriculture and urbanization have been rapidly taken place in this coastal zone (Choudri et al. 2015c). Such activities are related to population growth and have led to increasing pressures on natural resources including groundwater, agriculture and land use (Lawley et al. 2016). It also has resulted in some environmental challenges such as seawater intrusion, water and soil salination and desertification (Choudri et al. 2015a).

The management plans to mitigate the environmental challenges are constrained by the shortage of information about the interaction between the development activities and the environment (Rishi and Mudaliar 2014). In general, lack of information about the global, national and local land resources may lead to management plans



without environmental concerns (Mulder et al. 2011). Thus, there is a necessity for accurate, cost-effective and timely monitoring method to update the information on the status changes in the arable lands of coastal area (Mishra 2014), in order to develop a framework for the decision makers to manage the environmental problems.

Bajjali (2003) has conducted a study to assess the ground water quality in Oman by analyzing 20,000 wells across different regions. The study indicated that Al-Batinah coast is the most affected area with ground-water salinity in Oman, where the water salinity ranges from 5 to 44 dS/m (Choudri et al. 2015c). As reported by Choudri et al. (2015b), Ministry of Regional Municipalities and Water Resources collected salinity data from 18 different wells in Al-Batinah region during the years 1991, 1993, 2005 and 2010 (Table 2). The collected data suggested that water salinity has increased gradually in all examined wells within the last two decades. Furthermore, water salinity is an important factor in soil salinity (Al-Belushi 2003; Hussain 2005). Approximately 52% of Al-Batinah lands are affected by soil salinity (Al-Mulla et al. 2010). Between the years 2000-2005, the percentage of the agricultural lands affected with soil salinity has increased by about 7% (Al Barwani and Helmi 2006). In addition, soil salinity is considered as one of the main reasons of desertification in arid and semi-arid regions and so in Al-Batinah coast particularly (Al-Belushi 2003; Choudri et al. 2015b). On the other hand, soil salinization is considered as one of the main reduction factors of Omani dates exportation which decreased by 2,000 MT within a 5-year period (2007-2011). Similarly, production of date palm in Al-Batinah region has steadily declined within the last few years mainly due to ground-water salinity (Al-Yahyai and Khan 2015).

Although there are many studies investigated the

**Table 1.** Area of the agricultural lands in each governorate of Sultanate of Oman (feddan)

Governorate	Agricultural land Area (feddan)*	Percentage %
Muscat	11,555.85	3.26
Dhofar	65,921.13	18.57
Musandam	3,242	0.91
Al Buraimi	16,123.21	4.54
Ad Dakhiliyah	45,732.97	12.88
Al Batinah North	85,118.27	23.98
Al Batinah South	48,984.53	13.80
Ash Sharqiyah South	15,206.87	4.28
Ash Sharqiyah North	27,523.27	7.75
Adh Dhahirah	33,295.08	9.38
Al Wusta	2,307.9	0.65
Total	355,011.1	100

\*(M.A.F 2013)

salinity levels in Al-Batinah region using the traditional field visits and lab analysis, there is no documented evidences on evaluation of salinity change inward the coastal belt, and particularly using areal imaging technique. Therefore, the objective of this study was to analyze salinity change inward Al-Batinah coastal belt using images collected from an unmanned aerial vehicle (UAV) combined with color imaging techniques.



**Figure 1.** The Study Area location

## Materials and Methods

### Study Area

The study was conducted in Al-Suwaiq area (23° 50' 58" N, 57° 26' 19" E). It is located at the south part of Al-Batinah North governorate (Fig. 1). The climate of Al-Suwaiq is characterized as dry with average annual humidity of 32% and high evapotranspiration rate. The average air temperature of the coastal area is 28.5 °C and 17.8 °C in the mountain area. The average rainfall rate in Al-Suwaiq (as a part of Al-Batinah region) is 50 mm/year, varying in time and places within the region (Kwarteng et al. 2009).

### Sites Selection

Five sites were randomly selected within 0.3 to 6 km inland distance from the seashore of Oman through the agricultural land within the study area.

### Samples Collection and Analysis

In each of the five randomly selected sites, five locations were selected randomly to collect soil samples. A Global Positioning System device (Garmin eTrex Legend Cx GPS, USA) was used to register each location coordinates. At each location, three soil samples were collected from three different depths; 5 cm, 20 cm and 50 cm. Around 500 g of soil were taken with an auger to represent each depth. Each sample was kept in a clean plastic bag and annotated separately. A total of 75 soil samples were collected representing 5 sites × 5 locations × 3 depths. The saturation method was used to obtain soil extract from soil samples. Each soil extract was investigated for electrical conductivity (EC) which is expressed by deci-Siemens per meter (dS m<sup>-1</sup>). In addition, water

samples (one sample from each site) were collected from the irrigation water sources (wells) of each site and were kept in a clean plastic container and transferred to the lab for analysis. The EC of each water sample were measured using EC meter.

### Image Acquisition

Aerial images were taken by a digital color camera with 12.4 megapixels resolution. The camera was mounted on a quadcopter UAV (model: phantom-3-pro, DJI INC., China). Site images were taken from (130-275) m above the ground according to each site area. The captured images were saved in JPG format, which is a common format for realistic images and readable in different image processing softwares. The images were transferred to the computer to be analyzed.

### Image Analysis

Orthorectification was conducted as a pre-processing technique in order to enhance the site images and to decrease image distortion. The Environment for Visualizing Images (ENVI) software (version 5.0.3, Exelis Visual Information Solutions INC., US) was used for image Orthorectification using Ground Control Points (GCPs) and Replacement Sensor Model (RSM). The GCPs were collected using Google Earth software (Version: 7.1.7.2600, Google INC.).

Several vegetation indices which depends only on color bands; Green Leaf Index (GLI), Visible Atmospherically Resistant Index (VARI) and Triangular greenness index (TGI). GLI has been commonly used in thresholding the green vegetation in aerial images of canopy scales (Chianucci et al. 2016; Hunt Jr et al. 2013; Macfarlane and Ogden 2012). Thus, GLI was computed (Eqn. 1) to determine canopy attributes within each site



**Figure 2.** The locations of the selected sites

**Table 2.** Location of salinity monitoring wells in Al-Batinah region with the observed salinity (ppm) in 1991, 1993, 2005 and 2010

Well ID	Location (E)	Location (N)	1991*	1993*	2005*	2010*
N-101	578701	2621460	1504	1632	2112	3072
N-92	582083	2620091	839	833	835	849
T-52	584162	2622750	1606	2214	8262	12288
N-79	585655	2617956	800	931	1280	1798
B-49	586184	2622605	7379	8896	8979	9126
T-30	591740	2621062	9280	9421	10682	14784
N-107	575993	2623943	1187	1112	5114	10432
B-70	571376	2627585	5440	6573	6144	11520
B-73	572962	2627174	7571	7424	8800	9728
B-83	568271	2628276	8410	6298	9600	12160
T-46	585991	2621972	6720	7507	13120	16576
N-63	590404	2619803	1382	1312	5133	14656
B-31	594298	2620548	4032	4902	11494	11514
N-53	591385	2616842	1344	672	1293	1792
N-71	587411	2619729	1427	1267	1958	3590
N-111	568658	2623958	774	833	1760	1837
N-66	588832	2617526	2138	1760	1978	2323
T-85	569008	2627063	3994	3610	6278	8896

\*Observed salinity concentration (ppm#)  
 #ppm = dS/m x 640 (EC = 0.1 to 5 dS/m), ppm = dS/m x 800 (EC > 5 dS/m)

using MATLAB software (Version: 9.0.0.341360, Mathworks INC., USA).

$$GLI = (2G - R - B) / (2G + R + B) \tag{1}$$

Where G, R and B are the digital values (0-255) of the green, red and blue bands of each pixel. The GLI value of each pixel in the site image were calculated using equation 1. The GLI values were reconstructed by applying the MATLAB function (inpaint\_nans.m). Then, the GLI pixel values were averaged to get the GLI value of the whole image.

**Statistical Analysis**

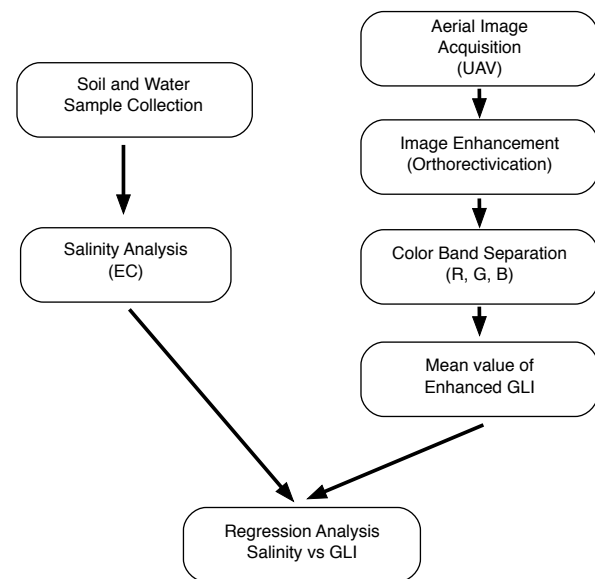
Pearson correlation coefficient was calculated to compare soil and water EC of each site with site distance from seashore. Regression analysis were used to esti-

**Table 3.** The correlation coefficient of each salinity parameter

Salinity Parameter	Correlation Coefficient
Soil EC (5 cm)	-0.94992
Soil EC (20 cm)	-0.87461
Soil EC (50 cm)	-0.7105
Water EC	-0.48239

mate soil and water salinity using the distance from the seashore and the value of GLI.

The method followed in this paper is illustrated in Figure 3.



**Figure 3.** Soil EC (dS m-1) of each site (1-5) at different soil depths (5, 20 and 50 cm)



## Results

### Soil and Water Analysis

The level of soil EC of the collected samples at different depths of 5, 20 and 50 cm were decreased with the increase of the soil depth, as shown in Figure 4.

### Effect of Seashore on Salinity Levels

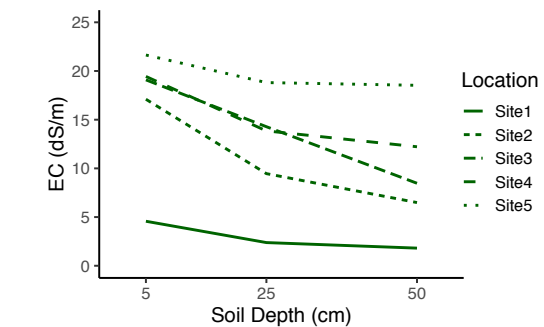
The effect of site location from seashore on salinity levels is illustrated in Figure 5. As the distance between the seashore and the selected sites increased, the water EC and soil EC decreased gradually. To investigate the effect of site location on the salinity levels, the water EC soil EC at different depths (5, 20, 50 cm) were correlated with the distance from the seashore as shown in Table 3. Water EC had the lowest correlation with the distance from the seashore ( $R = -0.48$ ). On the other hand, the EC of the soils in 5 cm depth had the highest correlation. Regression analysis was done to estimate the soil EC in 5 cm depth by knowing the distance from the shore using Eqn. 2 (Fig. 6).

$$y = -2.7671x + 22.643 \quad (R^2 = 0.902) \quad (2)$$

Where  $y$  is the EC (dS/m) of the top layer of soil and  $x$  is the distance from the seashore (km) to the selected site.

### Image Analysis

The image of site 2 is shown as an example in Figure 7. The averaged values of GLI had a strong negative cor-



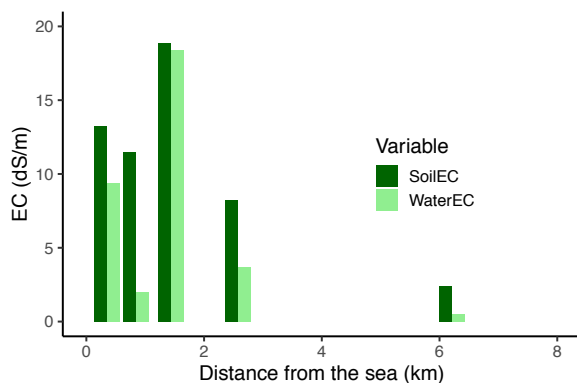
**Figure 4.** Steps followed to estimate soil and water salinity using GLI

relation with soil EC ( $R = -0.96$ ) and water EC ( $R = -0.92$ ). The GLI value of site image can be used to estimate site soil EC (Eqn. 3) and water EC (Eqn. 4) (Fig. 8).

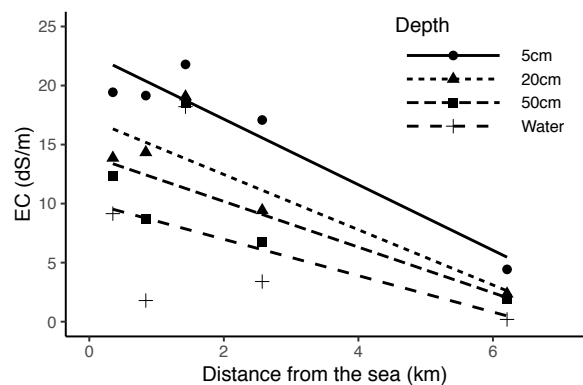
$$y = -2.0737x + 16.15 \quad (R^2 = 0.9128) \quad (3)$$

Where  $y$  is the soil EC (dS/m) and  $x$  is the mean value of GLI of the site image.

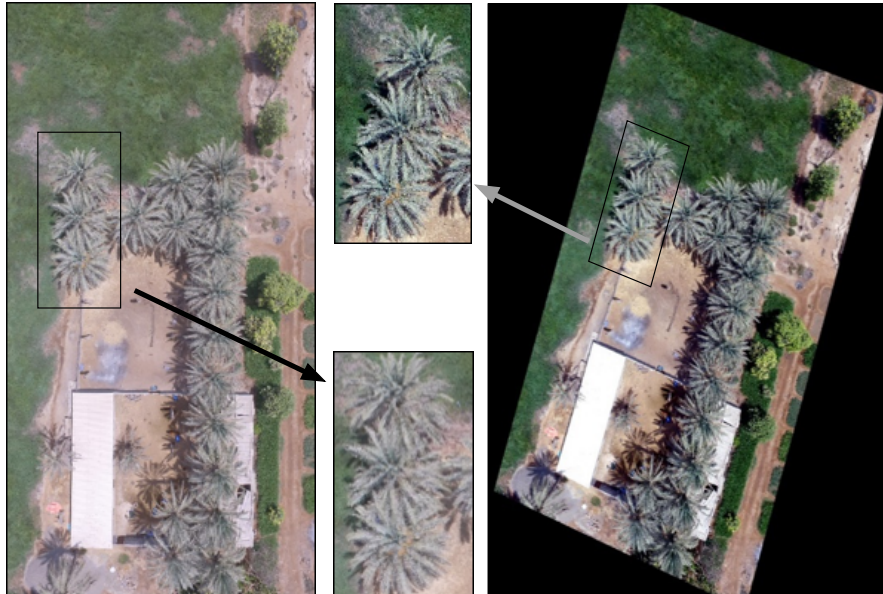
$$y = -2.3241x + 13.887 \quad (R^2 = 0.8429) \quad (4)$$



**Figure 5.** Soil and water EC (dS m<sup>-1</sup>) of each site (1-5) and site distance from the seashore



**Figure 6.** The regression analysis between the sites' distance from the seashore and their water EC and soil EC in different depths (5,20,50 cm)

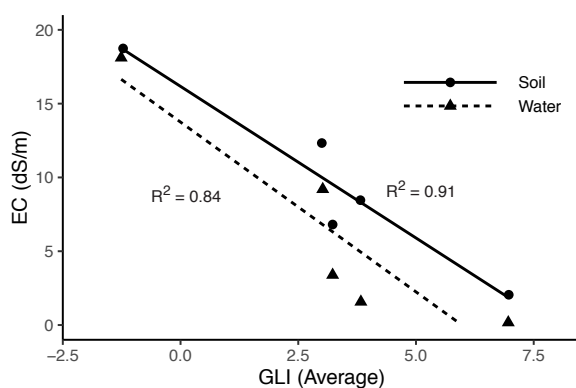


**Figure 7.** Orthorectification process of site number 2

Where  $y$  is the water EC (dS/m) and  $x$  is the mean value of GLI of the site image.

## Discussion

Soil and water salinity decreased as the site is located farther from the seashore (Fig. 5). Site (3) showed relatively unexpected increase in salinity levels, which could be due to the farming practices in the site. All other sites showed clear negative correlation between the distance to the site from the seashore and the salinity levels. On the other hand, an excellent correlation was observed



**Figure 8.** The regression analysis between GLI mean value of each site image and salinity levels of the site

while investigating the EC of soils from different depths with the distance from seashore (Table 3). The top soil layers showed the highest values of soil salinity, where that could be due to salt accumulation on the soil surface as reported by Herrero et al. (2003). It also had the strongest correlation ( $R = -0.95$ ) with distance from the seashore.

The GLI mean values of the images ranged from -1.2 to 6.8. The positive value of GLI was assigned to the green leaves or stems while the negative value was for non-green site objects like; soils, buildings, woods and other non-living items (Louhaichi et al. 2001). In this study it was found that the lowest mean value of GLI was -1.2 for site 1 with the highest salinity level. In general, the results proved that the soil and water salinity had strongly affected the vegetation quantity and quality (greenness), where the mean green value (GLI) declined as the salinity increased. Vegetation Soil Salinity Index (VSSI) were used by Tran et al. (2018) to estimate salinity intrusion from Landsat 8 images with  $R^2 = 0.6957$ . The salinity levels can be estimated by the mean value of GLI with relatively strong values of coefficient of determination, compared to other vegetation indices.

## Conclusion

This research proved the effect of salinity intrusion on site location from the seashore. The five randomly selected sites within the agricultural land belt with different distances from the seashore showed a decline in salinity levels as the site become far from the seashore. The effect of distance on soil salinity could be represented as a regression model. Mainly, this research demonstrated the possibility of using UAV with affordable digital camera to estimate the vegetation cover. The results showed

a strong negative correlation between salinity levels and GLI as an indicator of vegetation status. Salinity assessment using UAV colour images is coast efficient, time-less and more accurate in relative to field and satellite assessments. Nevertheless, more image processing techniques may strength the possibility of aerial images in estimation of salinity effects on vegetation cover.

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