Continuous Mapping and Monitoring Framework for Habitat Analysis in the United Arab Emirates

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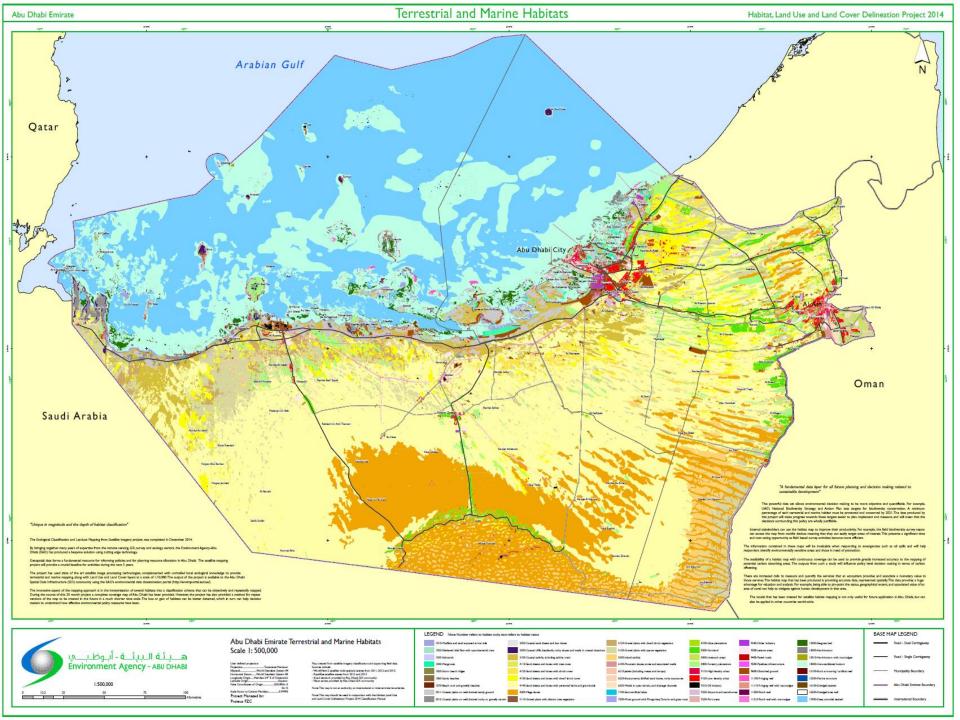
Introduction

- United Arab Emirates (UAE) has seen a tremendous growth in the last decades developing advanced urban centers in the world e.g., Abu Dhabi and Dubai
- Rapid development can put the environment under significant stress
- Need for continuous monitoring of the landcover and landuse to make informed decisions
- Environment Agency- Abu Dhabi (EAD) has developed a detailed Habitat, Land Use, Land Cover Map based on very high resolution satellite imagery acquired between 2011 and 2013 for the Abu Dhabi Emirate.

Habitat mapping in the UAE

- First comprehensive mapping exercise: 2013
 - A total land area of 60,000 km² and a marine area of 30,000 km² has been mapped at 1:10,000 scale with an accuracy of around 87% on an average.
 - A total of 54 different natural and man-made mapping categories at a very fine level of detail, with 41 terrestrial and 13 marine habitat categories.
 - The map serves as a baseline to assess the state of fragile habitats in Abu Dhabi Emirate.
 - WorldView-2 and RapidEye satellite data were used for the generation of the maps.

https://www.ead.ae/Publications/Abu%20Dhabi%20Habitat%20Mapping%202016/Habitat%20Book%2 0English%20Web.pdf



EAD Habitat Classification Codes

Type no.	Sub- type no.	Habitat type	MMUs (ha)	Туре no.	Sub- type no.	Habitat type	MMUs (ha)	Type no.	Sub- type no.	Habitat type	MMUs (ha)
1000		Intertidal habitats			4140	Sand sheets and dunes with perennial herbs and	25		8400	Forestry plantations	1
	1010	Mudflats and sand exposed at low tide	5			graminoids		9000		Urban habitat types	
	1020	Sheltered tidal flats with cyanobacterial mats	5		4200	Mega-dunes	25		9110	High density urban	
	1030	Saltmarsh	5	5000		Gravel plains (alluvial and interdunal)			9120	Low density urban	1
	1040	Mangroves	5		5110	Gravel plains with distinct tree vegetation	25		9210	Oil industry	1
	1050	Storm beach ridges	5		5120	Gravel plains with dwarf shrub vegetation	25		9220	Airports and Aerodromes	
	1060	Sandy beaches	5		5130	Gravel plains with sparse vegetation	25		9230	Port Areas	1
	1070	Beach rock and gravelly beaches	5		5200	Inland sabkha	25		9240	Other industry	1
2000		Coastal plains, sand sheets and low dunes		6000		Mountains, rocky terrain and wadis			9300	Leisure areas	1
	2011	Coastal plains on well-drained sandy ground	25		6100	Mountain slopes, screes and associated wadis	25		9400	Paved roads	1
	2012	Coastal plains on well-drained rocky or gravelly	25		6210	Jebels (including mesas and burqas)	5		9500	Pipelines infrastructure	1
		terrain			6220	Escarpments, lithified sand dunes, rocky exposures	5		9600	Disturbed ground	1
	2020	Coastal sand sheets and low dunes	5		6320	Wadis in open terrain, and drainage channels	25			Marine Habitat types	
	2030	Coastal cliffs, headlands, rocky slopes and wadis in coastal situations	5	7000		Inland standing water habitats and habitats of moist ground		11,000		Coral Reef	
3000		Coastal sabkha, including Sabkha Matti			7100	Semi-artificial lakes	1			Fringing Reef	
	3100	Coastal sabkha, including Sabkha Matti	25		7200	Moist ground with Phragmites, Tamarix and grass	5		11,110	Fringing Reef with Macroalgae	
4000		Sand sheets and dunes			/200	mats				Patch Reef	
				8000		Oases, Farmland and Forestry			11,210	Patch Reef with Macroalgae	
	4110	Sand sheets and dunes with tree cover	25		8100	Date plantations	1	12,000		Seagrass Bed	
	4120	Sand sheets and dunes with shrub cover	25		8200	Farmland	1	13,000		Hard-Bottom	
	4130	Sand sheets and dunes with dwarf shrub cover	25		8300	Livestock areas	1		13,010	Hard-Bottom with Macroalgae	
					0500		•	14,000		Unconsolidated Bottom	
								15,000		Marine Construction	
									15,100	Rock Armouring/Artificial Reef	
									15,200	Marine Structure	
								16,000		Dredged Areas	

16,100Dredged Sea Bed16,200Dredged Area Wall

Deep Seabed

17,000

Habitat Mapping in the UAE

- Banking on the effort of the EAD, there is an ongoing effort to extend the process to cover the entire UAE with key stakeholders like UAE Space Agency and Ministry of Climate Change and Environment leading the initiative.
- The aim is to generate a highly detailed classification with over 55 classes and at a spatial resolution of less than 5 m for the entire country.
- The work also aims to develop a methodology to perform updates to the maps in short intervals of less than 2 years as against 5-6 years which is normally accepted globally.
- In the first phase, four areas are considered for the development and validation of the methods.

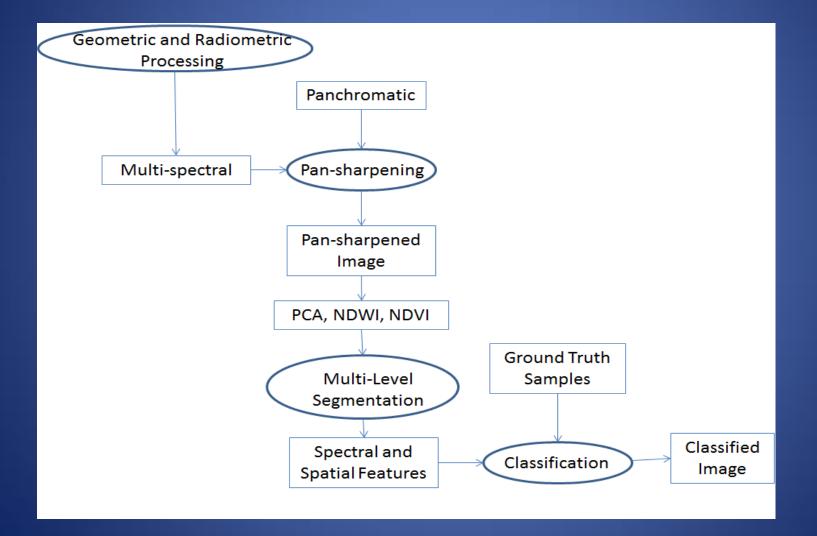
Proposed Work

 Two approaches are considered to generate the land use, land cover maps.

Segmentation-based classification

Convolutional Neural Network based advanced classification

Segmentation-based classification

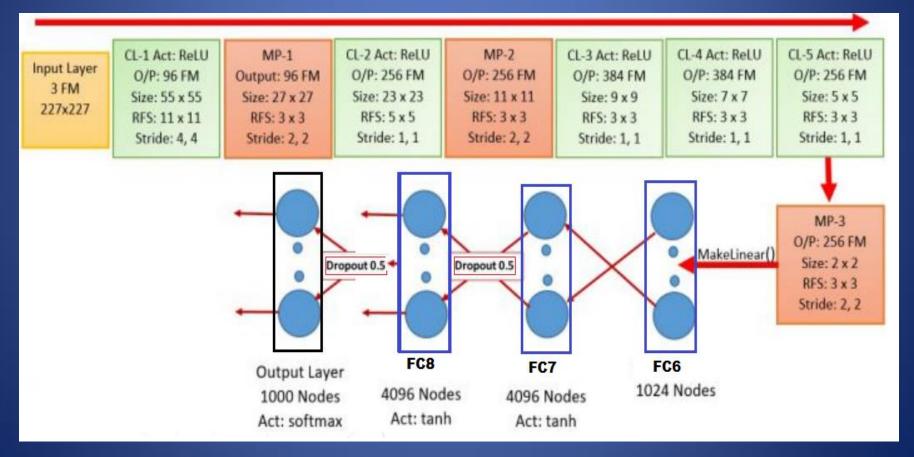


CNN-based classification

Feature Generation Using Alexnet conv1 conv 2 conv4 conv5 conv 3 55 27 FC6 FC7 FC8 13 13 13 Input Image 11 13 13 13 27 227 Input 256 384 384 Image 1000 RGB) Max 256 pooling 4096 4096 Max Max pooling pooling Stride 96 227 of4 **Using Fully** Connected Feature Classification

CNN-based classification

• AlexNet framework is used in this work.

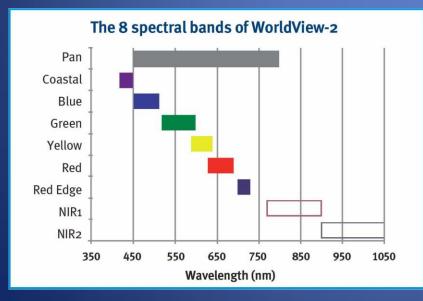


CNN-based classification

- We use an approach of 'Ensemble of Random Forests' to classify the features (i.e. 4096 FC7 features) generated from AlexNet framework.
- Multiple Random Forests are employed to with around 20% sampling of the available training data and a majority voting is performed to decide the final class at every pixel.

Data

Images acquired by WorldView-2 satellite are used in this work at the four locations indicated in the figure. The final spatial resolution is 0.5 m after pan-sharpening





Results

Segmentation based approach



Image

- Airports And Aerodromes
- Coastal Plains On Well-Drained Sandy Ground Mudflats And Sand Exposed At Low Tide
- Coastal Sabkha, Including Sabkha Matti
- Coastal Sand Sheets And Low Dunes
- Date Plantations
- Disturbed Ground
- Forestry Plantations
- High Density Urban
- Leisure Areas
- Livestock Areas
- Low Density Urban

EAD Map

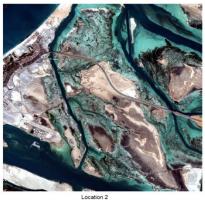
- O Mangroves
- - Oil Industry
 - Other Industry
 - Paved Roads
 - Pipelines Infrastructure
 - Port Areas
 - Saltmarsh
 - Semi-Artificial Lakes
 - Sheltered Tidal Flats With Cyanobacterial Mats
 - Water



Proposed Method Accuracy = 84%

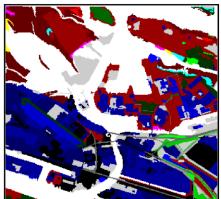
CNN Approach

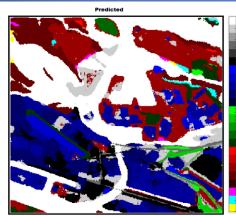


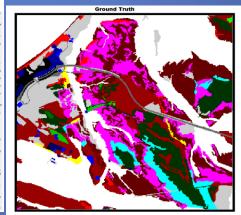


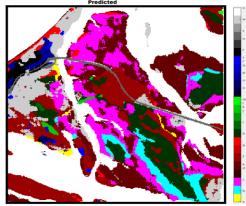
Location 1

Ground Truth









Average accuracy > 92%

Conclusions

- Two methods are developed as an attempt to generate classification maps to replicate the earlier work in the emirate of Abu Dhabi at four randomly selected sites.
- The CNN-based approach has shown great potential in producing relatively high accuracy maps in comparison to the segmentation based approach.
- We are currently extending this work to cover entire Abu Dhabi emirate in the first phase which will be extended to the other emirates after updating the classification codes to integrate class definitions from other habitat classes