

# Optimizing Multiresolution Segmentation for Extracting Plastic Greenhouses from WorldView-3 Imagery

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"Object-based horticultural crop under greenhouse identification using stereo imagery of WorldView-3 satellite and Landsat 8 time-series"

(AGL2014-56017-R)

https://www.ual.es/Proyectos/GreenhouseSat/

















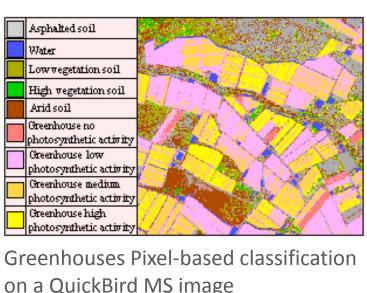




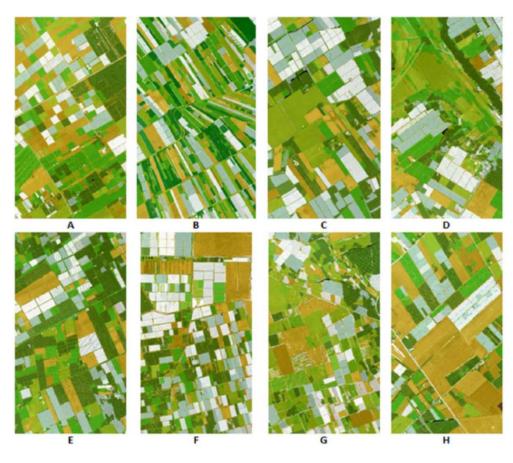


#### **Pixel-based vs Object-based**

Commercial VHR satellite imagery => Object-based image analysis (OBIA)



on a QuickBird MS image



Bare soil Hail net vineyard Orchard Plastic sheet vineyard Uncovered vineyard Vegetables

classes

Greenhouses Object-based classification. The first work by Tarantino and Figorito (2012)

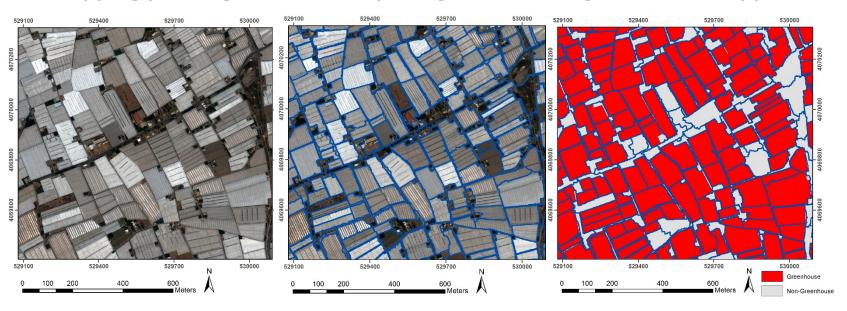






#### **GreenhouseSat Project**

#### 1.- Mapping plastic greenhouses by using satellite images and OBIA approach.



#### 2.- Identifying horticultural crop under plastic greenhouse cover.



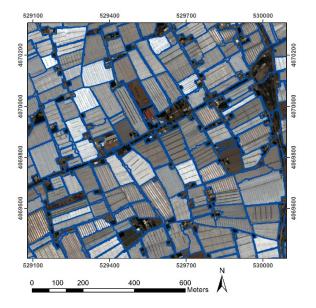




#### **Objectives**

To find the best segmentation over plastic greenhouses from a WorldView-3 bundle image (PAN and MS images) under an OBIA framework:

- ✓ Looking for the optimum tuning parameters of MRS algorithm (i.e., scale, shape, compactness and bands combination) in order to delineate plastic greenhouses.
- ✓ Several VHR image sources (WorldView-3 PAN, MS and atmospherically corrected MS orthoimages) are going to be studied also in the case of plastic greenhouses.
- ✓ To study the influence of the number of geometries on the final results.

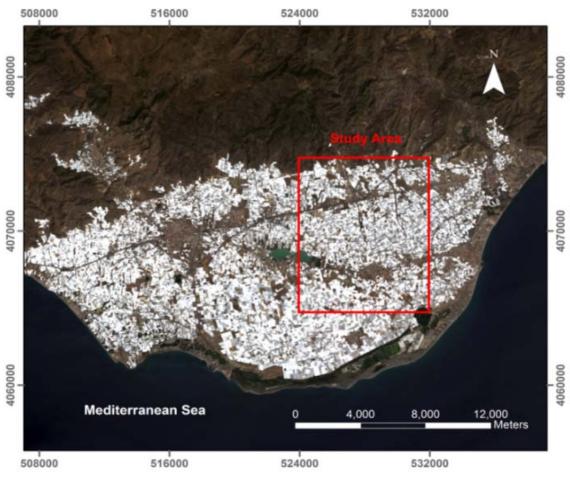






### **Study site**







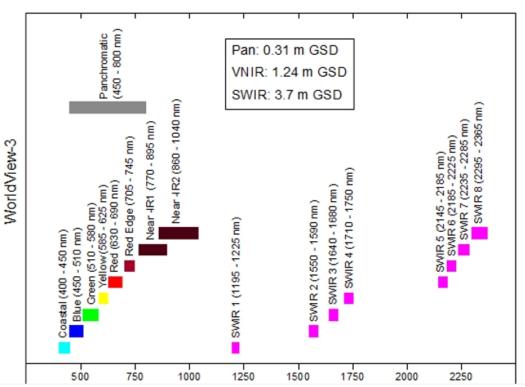




#### **Satellite Image Used**

#### WorldView-3 (WV3)

- Launched in August 2014
- 3 days revisit time
- Commercial VHR satellite



Wavelength (nm)

#### 11 July 2016



PAN image, 0.3 m GSD



MS image RGB, 1.2 m GSD

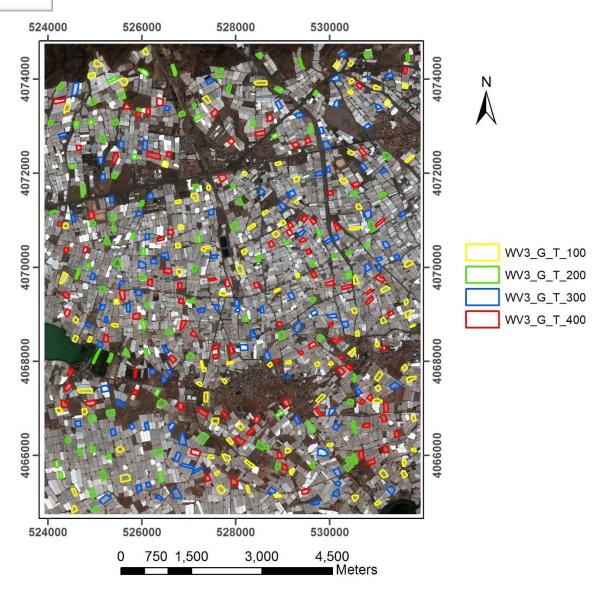






#### **Reference Greenhouses**

First step: To digitalize the Reference Greenhouse polygons (100, 200, 300 and 400)





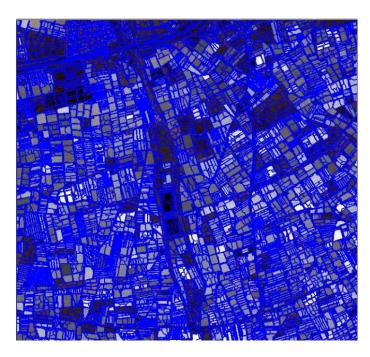




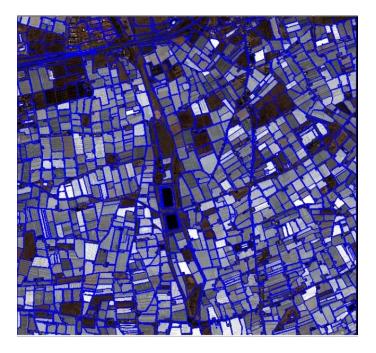
#### **Image Segmentation**

Second step: Multiresolution Segmentation (MRS) and eCognition to produce the outputs.

MRS algorithm is controlled by four factors: (i) the **Scale** parameter (SP), (ii) **Shape** (SH), (iii) **Compactness** (CP) and the layer (bands) of information used.



SP=15, SH=0.3, CP=0.5, 8 MS bands



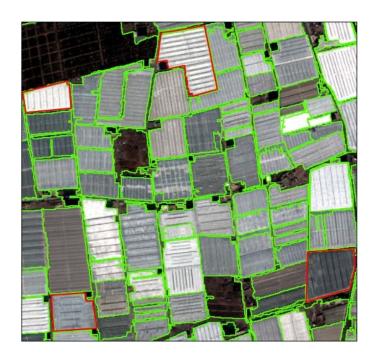
SP=50, SH=0.3, CP=0.5, 8 MS bands



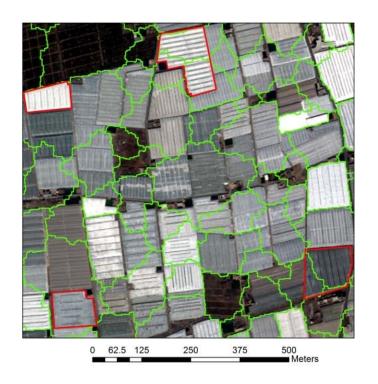


#### **Image Segmentation**

**Second step:** The **image segmentation** using multiresolution segmentation (MRS) included into eCognition. MRS algorithm is controlled by dour factors: (i) the Scale parameter (SP), (ii) Shape (SH), (iii) Compactness (CP) and the layer (bands) of information used.



SP=50, **SH=0.1**, CP=0.5, 8 MS bands



SP=50, **SH=0.9**, CP=0.5, 8 MS bands



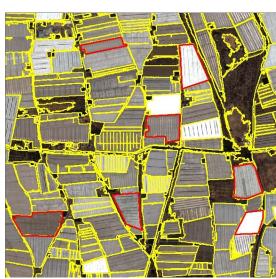




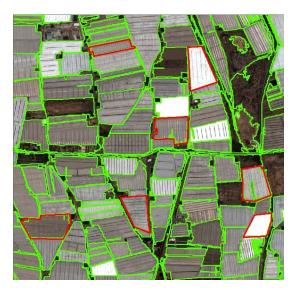
#### **Image Segmentation**

**Second step:** Thousands of segmentations from applying MRS algorithm were generated for three WV3 orthoimages (SP step 1; SH from 0.1 to 0.5 step 0.1; CP=0.5, Bands BGNIR2):

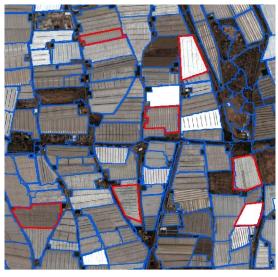
- (i) PAN Orthoimage, 0.3 m GSD
- (ii) MS Orthoimage with original DN
- (iii) MS Orthoimage atmospherically corrected (ATCOR).



**PAN SP=1101**, **SH=0.4**, CP=0.5, PAN



MS SP=195, SH=0.5, CP=0.5, BGNIR2



**MS ATCOR SP=50**, **SH=0.4**, CP=0.5, BGNIR2

#### What segmentation is the best?







#### **Segmentation Assessment**

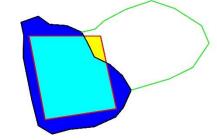
a) Shape parameter 0.3

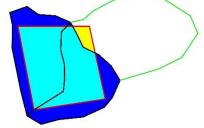
b) Shape parameter 0.9

c) Arithmetic discrepancy

**AssesSeg Tool** 



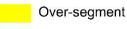




Corresponding segment

Reference Polygon

Overlapped area
Under-segment



No corresponding segment

It is based on a modified version of **ED2** supervised discrepancy measure proposed by Liu et al. (2012).

It tries to optimize in a two dimensional Euclidean space both the **geometrical discrepancy** (by mean of the potential segmentation error, **PSE**) and also the **arithmetic discrepancy** between image objects and reference polygons (by using the number-of-segmentation ratio, **NSR**)

$$ED2 = \sqrt{(PSE)^2 + (NSR)^2}$$

Novelli et al., 2017. AssesSeg - A command line tool to quantify digital image segmentation quality: a test carried out in southern Spain from Satellite imagery. Remote Sensing.

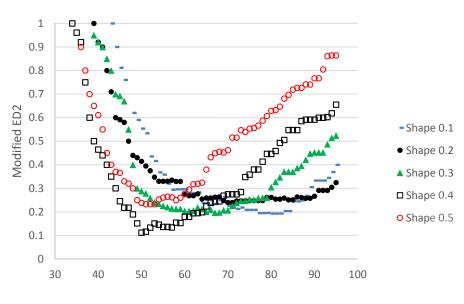




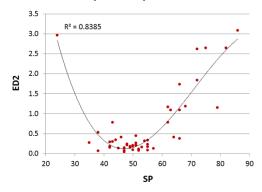


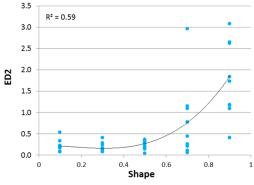
#### **Results**

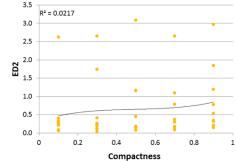
Ideal MRS outputs achieved with the different image sources (WV3) tested for each set of RG.



Modified ED2 computed by using AssesSeg for all the MRS outputs from MS ATCOR orthoimage and 100 reference geometries. The best segmentation turned out to be the attained by Scale = 50 and Shape = 0.4











#### **Results**

#### Image source, Nº of Reference Geometries and combination bands??

Ideal MRS outputs achieved with the different image sources (WV3) tested for each set of RG.

Image Source	No. Reference Geometries	Ideal Segmentation Parameters			Modified
		Scale	Shape	Compactness	ED2
MS (used bands: Blue- Green-NIR2)	400	210	0.5	0.5	0.205
	300	221	0.5	0.5	0.207
	200	220	0.5	0.5	0.193
	100	195	0.5	0.5	0.221
MS ATCOR (used bands: Blue- Green-NIR2)	400	60	0.4	0.5	0.141
	300	68	0.3	0.5	0.146
	200	68	0.3	0.5	0.129
	100	50	0.4	0.5	0.112
PAN (used band: PAN)	400	1152	0.4	0.5	0.183
	300	1150	0.4	0.5	0.178
	200	1099	0.4	0.5	0.179
	100	1101	0.4	0.5	0.203

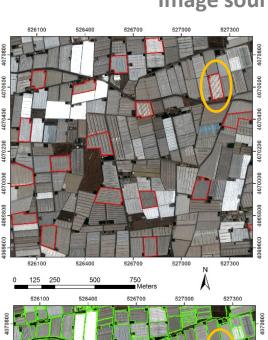




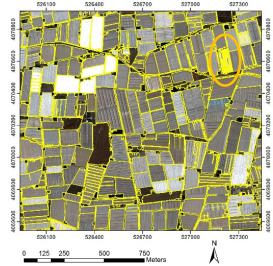


#### **Results**

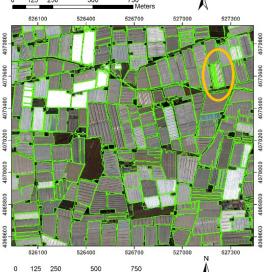
#### Image source, Nº of RG and combination bands??



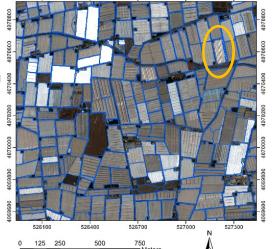
Reference geometries (Red polygons)



Ideal segmentation from WV3 PAN orthoimage.



Ideal segmentation from WV3 MS orthoimage.



Ideal segmentation from WV3 MS ATCOR orthoimage. ED2=0.11







#### **Conclusions**

- ✓ WV3 MS ATCOR corrected orthoimage was the best image data source to attain the best greenhouses segmentation according to the modified ED2 metric including into AssesSeg.
- ✓ Modified ED2 metric presented a very good agreement with the visual quality of the greenhouse segmentations. AssesSeg allowed easily checking a high number of MRS parameters combinations.
- ✓ The number of reference geometries to compute ED2 should be much higher than 30. In fact, when the class to be segmented is very heterogeneous, sets of references higher than 200 should be considered.







## Thanks for your attention















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