

# SPECTRAL RULES AND GEOSTATISTICAL FEATURES FOR CHARACTERIZING OLIVE GROVES IN QUIKBIRD IMAGES

<sup>1</sup>N. Amoruso, <sup>2</sup>A. Baraldi, <sup>1</sup>P. Blonda

<sup>1</sup>CNR-ISSIA, Via Amendola 122/D, 70126 Bari, Italy

Phone: +39 080 5929433, Fax: +39 080 5929460, E-mail: [blonda@ba.issia.cnr.it](mailto:blonda@ba.issia.cnr.it)

<sup>2</sup>European Commission Joint Research Centre, Via E. Fermi 1, I-21020 Ispra (Va), Italy,

Phone: +39 0332 786538, Fax: +39 0332 785154, E-mail: [andrea.baraldi@jrc.it](mailto:andrea.baraldi@jrc.it)

## 1. INTRODUCTION

In this work the algorithm proposed by Sanz in [1] for the extraction of class specific texture features has been implemented and evaluated for discriminating between forests and permanent crops, specifically olive groves, in VHR QuikBird images. The algorithm is based on the variogram-method which was applied in [1] on aerial imagery at 50-cm resolution. The algorithm can estimate arbitrarily shaped texture of regions with one or two orientations in multi-spectral images and then differentiate classes characterized by similar spectral features. It is based on the following characteristics: a) the period  $T$  is defined as the distance between texture elements named *texton* and it differs from zero if texture is oriented; b) the direction of the principal orientation texture  $\theta_1$ ; c) the direction of the secondary orientation texture  $\theta_2$ . The algorithm has been introduced in a two-stage stratified hierarchical classification system of QuikBird images, as recently proposed in [2]. In this work in the first stage of the system the Maximum-Likelihood classifier adopted in [2] has been substituted by the Landsat-like image fully automated spectral rule-based per-pixel classifier (LSRC), properly down-scaled to deal with QuikBird images and recently proposed in the literature [3]. This down-scaled version of LSRC indicated as Quick Bird-like SRC, i.e. QSRC non-contextual visual properties exclusively to provide a preliminary spectral map of the image. The second stage, which is required to compensate for the reduced spectral resolution of QuikBird images, is composed by a battery of class-specific classification modules. The variogram- method is used in this second stage to discriminate classes according to their precise orientation characteristics, if present, and is applied to the panchromatic band of the image.

The results obtained in the analysis of a QuikBird image of an area characterized by intensive olive trees cultivation in Southern Italy reveals the effectiveness of the proposed approach. The automatic detection of both tree plantation directions and tilling practice orientation with respect to hill slope may have several applications, for instance in the development of soil loss prevention measurements or in precision farming.

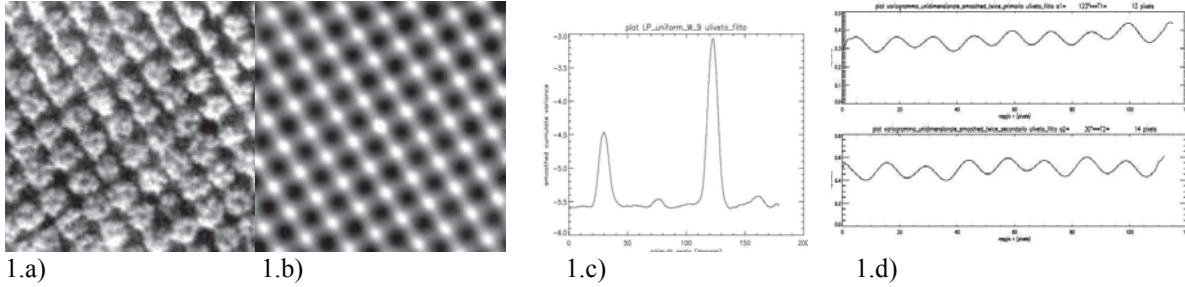
## 2. MATERIALS AND METHODS

Precise orientation characteristics are extracted by the variogram of the panchromatic QuikBird image band to differentiate between oriented ( e.g olive trees, vineyards, tilled fields) and not oriented classes (e.g. forest, untilled fields). In addition, for oriented classes, e.g. olives trees, the normalized variogram reproduces the direction and inter-row spacing present in the original image. Consequently, it is possible to determine the number of orientations (e.g. two for olive trees and orchards, one for tilled fields and vineyards) and their specific periods, which depends on agricultural practices. A QuikBird image acquired in Southern Italy on January 16 2005 has been considered. The attention is focalized on the automatic detection of orientation and period estimation of young and old olive trees as class specific texture features to be used in the second stage of a hierarchical classification system. The image has been radiometrically calibrated before producing a Pan-Sharpned image (PS) according to [4]. A preliminary spectral map has been provided by QSRC from the PS image. The panchromatic band, properly masked by specific class spectral category has been used as input to the variogram based algorithm. The validation of orientations and period values automatically has been carried out against ground truth.

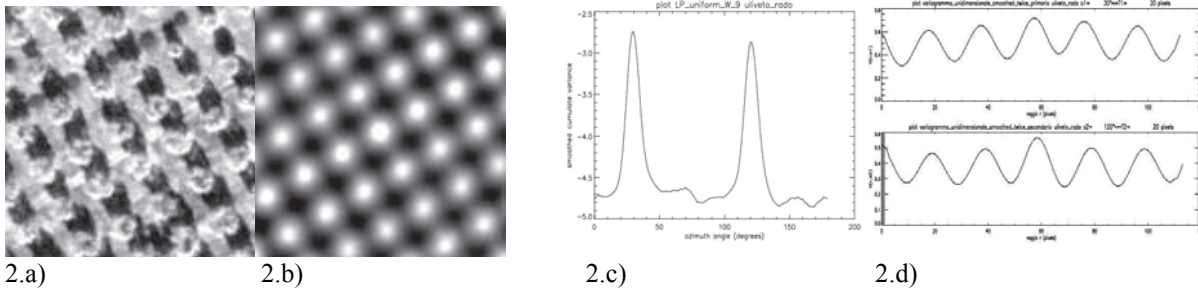
## 5. RESULTS AND CONCLUSIONS

An experimentally determined threshold  $K_p$  (in this image  $K_p=0.65$ ) is applied to variogram values to separate regions not having any directionality from regions with directionality. For latter regions direction and period estimation is carried out. In Figure 1 to 3 the normalized variogram for old and young olive trees are reported along with: the values of the dominant

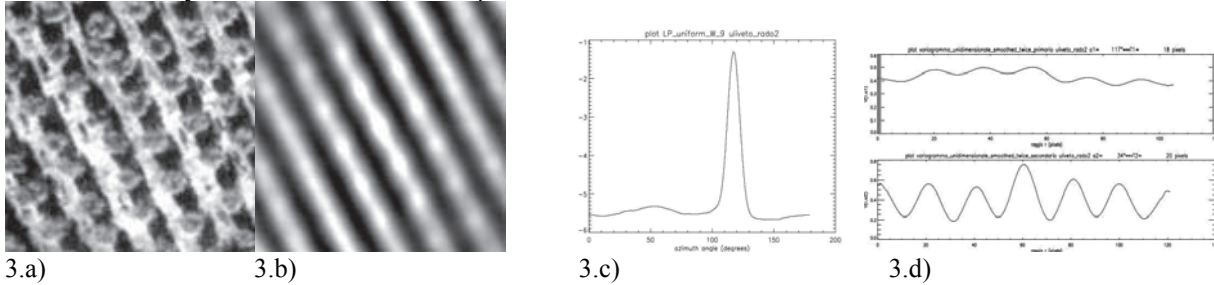
**Figure 1.** 1.a) Panchromatic moving window on a Dense (old) olive trees field; 1.b) normalized variogram; 1.c) variogram cumulative variance  $A(\alpha)$ ; 1.d) Variogram along two directions  $\theta_1$  and  $\theta_2$ , where:  $\theta_1=123^\circ$  and period  $T_1=12$  pixels;  $\theta_2=30^\circ$  and period  $T_2=14$  pixels;  $\theta_1$  and  $\theta_2$  have been extracted from cumulate variance  $A(\alpha)$ .



**Figure 2.** 2.a) Young olive trees; 2.b) normalized variogram; 2.c) variogram cumulative variance; 2.d) variogram along two directions:  $\theta_1=30^\circ$ ,  $T_1=20$  pixels,  $\theta_2=120^\circ$ ,  $T_2=20$  pixels;  $\theta_1$  and  $\theta_2$  output from cumulate variance  $A(\alpha)$



**Figure 3.** 3.a) Young olive trees in a problematic condition, i.e. shadows and bright soil in background; 3.b) normalized variogram; 3.c) variogram cumulative variance; 3.d) variogram along two directions, i.e. the dominant direction  $\theta_1=117^\circ$ , and the secondary direction  $\theta_2=34^\circ$ ,  $T_2=20$  pixels.



orientation  $\theta_1$  and the secondary orientation  $\theta_2$ . The corresponding period values obtained after filtering the variogram function along  $\theta_1$  and  $\theta_2$ . The focus of the paper is on the application of geostatistic variogram concepts to extract class specific features, with particular attention to olive groves, to be used in a multi-stage hierarchical classification system of QuikBird images.

## 11. REFERENCES

- [1] R.T. Sanz, "Texture orientation and period estimator for discriminating between forests, orchards, vineyards, and tilled fields", IEEE Trans. on Geosc. And Remote Sensing, vol.44, no.10, Oct 2006.
- [2] A. K. Shackelford and C.H. Davis, "A hierarchical fuzzy classification approach for high-resolution multispectral data over urban areas", IEEE Trans. on Geosc. and Remote Sensing, vol. 41, no. 9, pp. 1920-1932, Sept 2003.
- [3] A. Baraldi, M. Stasolla, V. Puzzolo, L. Durieux, D. Simonetti, G. Conchedda, F. Holez, and P. Blonda, "Automatic spectral rule-based preliminary classification of radiometrically calibrated SPOT-4/-5/IRS, AVHRR/MSG, AATSR, IKONOS/QuickBird/OrbView/GeoEye and DMC/SPOT-1/-2 imagery – Part I: System design and implementation," submitted to IEEE Trans. on Geosc. and Remote Sensing, on December 2008.