

# Optimized data-gluing method for mixed analog/photon-counting lidar signals

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## SUMMARY

In atmospheric LIDAR (Light Detection and Ranging) remote sensing, the dynamic range of the return power signals can span up to five orders of magnitude. Modern acquisition systems such as those based on Licel<sup>TM</sup> transient recorders combine a dual acquisition mode in which the return signal is recorded simultaneously in both analog (analog-to-digital (AD) conversion) and photon-counting (PC) modes. Although both data records can be analyzed separately, their combination obtained through gluing gives the advantage of the high linearity of the AD conversion for high light-level signals (especially in the near range) and the high sensitivity of the PC mode for low light-level signals (in the far range).

Recently, eruptions of volcanoes such as Eyjafjalla (Iceland) in 2010, Grímsvötn (Iceland), Puyehue (Argentina), Nabro (Eritrea) and Mount Lokon (Indonesia) in 2011 have yielded emergency situations with a strong economical cost due to human evacuation and/or air traffic interruption. Volcanic aerosols are first injected in the troposphere and often reach the stratosphere where they can reside for several years. The mixed analog/photo-counting acquisition approach is particularly suitable for the detection of volcanic aerosols in both the troposphere (near/mid range) and the stratosphere (far range).

In this line, a case study showing volcanic aerosols from the Nabro volcano (Eritrea, 2011) in the stratosphere and simultaneously Saharan dust in the troposphere over the multi-spectral Barcelona lidar station during the period 27 June – 1 July 2011 is presented. The benefits of the proposed gluing technique will be shown through the comparison of analog, PC, and glued backscatter-coefficient time series.

Existing gluing algorithms solve the fitting coefficients by matching both analog and PC data over a predefined spatial range (or equivalently, over a predefined upper and lower counting rate) depending on which kind of photodetector (usually a photomultiplier) is being used. In this work, an enhanced data-gluing formulation is presented. The method automatically finds the spatial range where both analog and PC signals are more similar based on Euclidian distance minimization over piece-wise range intervals along the whole acquisition spatial range.

**Key words:** Lidar, volcanic eruptions, tropospheric and stratospheric aerosols, gluing.

## 1. INTRODUCTION

Today, an important research line in the field of signal processing of atmospheric-lidar signals is the pre-processing and multi-spectral inversion of atmospheric elastic/Raman signals, and in co-operation with passive sensors (WMO GAW, 2007; Ansmann et al., 1992). Key data products range from simple range-corrected atmospheric quick-looks to the retrieval of aerosol microphysical parameters (Böckmann, 2001).

In Europe, EARLINET is the ground-based atmospheric lidar observation network at continental scale (Matthias et al., 2004; Böckmann et al., 2004; Pappalardo et al., 2004). In the RSLAB (Remote Sensing Laboratory), an important effort within EARLINET has been the development of a scanning 2+1 elastic/Raman lidar system (1997-2007) and the ongoing development of the 3+2+1 multi-spectral (UV-VIS-NIR) lidar system since 2003 (Kumar et al., 2006). The acquisition system in reception is based on Licel<sup>TM</sup> TR40-80 transient recorders, which provide simultaneous analog/PC acquisition of lidar signals by combining a 40-Msps, 12-bit ADC with a

250-MHz photon counter. Licel transient recorders have a parallel analog and PC detection chain. The combination (i.e., gluing) of both analog and PC signals gives the high linearity of the analog signal for strong signals and the high sensitivity of the photon counting for weak optical signals (Licel, 2007). Thus, the dynamic range of clean-data glued lidar signals can reach up to 5 orders of magnitude. To glue both signals, the PC channel must also be dead-time corrected (Whiteman, 2003; Hamamatsu, 1998).

## 2. ENHANCED GLUING ALGORITHM

The basic gluing algorithm proposed by Licel<sup>TM</sup> (2007) combines analog- and PC-recorded signals in a *fixed* fitting range interval  $[R_A, R_B]$ , where both analog and PC signals are valid and have a high signal to noise ratio. Licel's gluing algorithm minimizes the error norm between the dead-time-corrected photon-counted (PC) signal,  $\vec{V}_{pc}$ , and a scaled and offset version of the analog signal,  $\vec{V}_a$ , for the solving parameters  $a$  (scaling) and  $b$  (offset) in the fitting interval  $[R_A, R_B]$ . That is,

$$\min \left\{ \|\varepsilon_I\|_{a,b}^2 \right\} = \min \left\{ \left\| \vec{V}_{pc} - (a\vec{V}_a + b) \right\|_{a,b}^2 \right\} \quad I \in [R_A, R_B], \quad (1)$$

where the error vector is defined as

$$\vec{\varepsilon}_I = \vec{V}_{pc} - (a\vec{V}_a + b), \quad (2)$$

with  $\vec{V}'_a = a\vec{V}_a + b$ , the scaled-and-offset analog signal.

For a typical mini-PMT the fitting interval corresponds to the range interval where the PC signal is in the 0.5-to-10-MHz region. In Eq.(1) the residual error norm  $\|\vec{\varepsilon}_I\|^2$  is an indicator of the quality of the fitting. Besides,  $\|a\vec{V}_a\| \gg b$  so that the scaling parameter  $a$  is the dominant parameter in the residual.

The enhanced gluing method proposes a fine-tuning automatic-search algorithm to find the best fitting range interval  $I$  ensuring minimum residual error norm. Towards this goal a two-step procedure is followed:

1) First, the central point of the best fitting range interval,  $I_i$ , is obtained. To do that, the modified form of Eq.(1) above,

$$\min \left\{ \|\vec{\varepsilon}_{I_i}\|_{a_i, b_i}^2 \right\} = \min \left\{ \left\| \vec{V}_{pc} - (a_i\vec{V}_a + b_i) \right\|_{a_i, b_i}^2 \right\} \quad \text{in } I_i \quad (3)$$

is solved for  $\vec{x}_i = (a_i, b_i) \leftrightarrow I_i$  along successive adjacent

fitting range intervals  $I_i \in (R_A^i, R_B^i)$  of constant length ( $\Delta R = 100\text{m}$ ) centered at the range  $R_i$ . In practice,  $R_i$  is incremented in steps of  $\Delta R$  along the measurement range. When the scaling parameter  $a_i$  is plotted as function of the central range of the fitting interval,  $R_i$ , a parabolic behaviour is obtained. The parabolic behaviour of the error norm is in accordance with the foundations of maximum-likelihood classical estimation methods (Barlow, 1989). The minimum of the parabola, yields the sought-after central point,  $R_{opt}$ , of the best fitting interval along the measurement range.

2) Once  $R_{opt}$  has been determined, the end points of the best fitting range interval,  $R_A^{opt}$  and  $R_B^{opt}$  (i.e., left and right to the central point  $R_{opt}$ ) are computed from the intercept points between the error parabola and a threshold level 1% above the minimum of the parabola (i.e.,  $a_\gamma = 1.01a_{opt}$ , in Fig. 2). The 1% criterion has been determined by experiment and yields a typical fitting length,  $R_B^{opt} - R_A^{opt}$ , of about 1.5 km, which is approximately the same fitting length as in the basic gluing algorithm of Eq.(1).

Because  $\|a_i\vec{V}_a\| \gg b_i$  also holds for Eq. (3), the error norm,  $\|\vec{\varepsilon}_{I_{opt}}\|^2$  is also minimum when so is the scaling parameter  $a_i$ , thus guaranteeing an optimal fitting.

### 3. CONCLUDING RESULTS

Saharan dust intrusion episodes are frequent in the Iberian Peninsula (Pérez et al., 2006) and occur at low-troposphere heights. Because of the high intensity of the lidar returns in the near-range range, these dust episodes are nicely recorded by the analog channel and poorly recorded by the PC channel,

which saturates due to the large number of counts in the near-range. The opposite situation occurs when monitoring volcanic eruptions (Guerrero et al., 2010), which inject volcanic aerosols up in the stratosphere. At such heights, the lidar returns are too faint to be properly recorded within the sensitivity of the analog channel (only a few ADC levels are “moved” and with a very poor signal-to-noise ratio (SNR)).

In Fig. 1, the analog signal is very noisy at the high range around 17 km so that volcanic aerosols cannot be distinguished from noise. PC signal fails to display aerosol layers below about 3 km. In contrast, the glued quick look of Fig. 2 and Fig. 3 evidences with a good signal-to-noise ratio both Saharan dust layers in the 0-4 km subplot (low range) and volcanic aerosols in the 15-18 km subplot (high range).

### 4. ACKNOWLEDGMENTS

This work was supported by the European Union under the project ACTRIS (Aerosols, clouds, and Trace gases Research Infrastructure Network) ref. n° FP7- INFRA-2010-1.1.16, the European Space Agency under the project 21487/08/NL/HE, the Spanish Ministry of Science and Innovation (MICINN) and FEDER (European Regional Development) funds under the project TEC2009-09106 and Complementary Actions CGL2009-08031-E/CLI (“Charmex”) and CGL2008-01330-E/CLI.

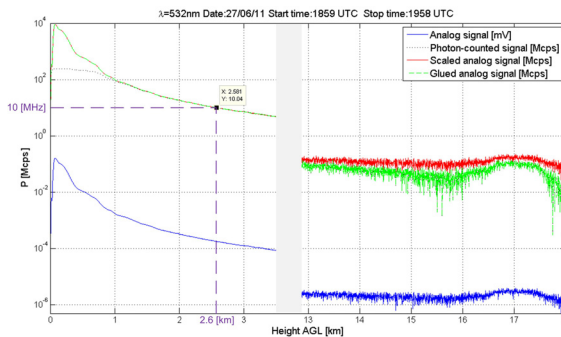
MAEC – AECID (Spanish Ministry of Foreign Affairs and Cooperation) and Generalitat Catalunya/AGAUR are respectively thanked for Mr. D. Lange’s and Mr. D. Kumar’s pre-doctoral fellowships.

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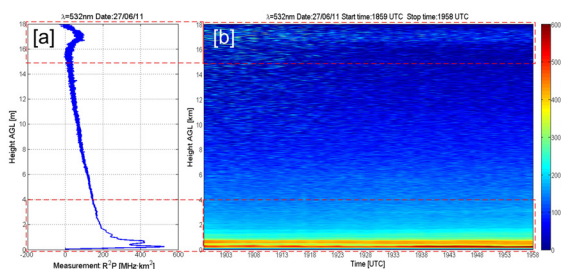
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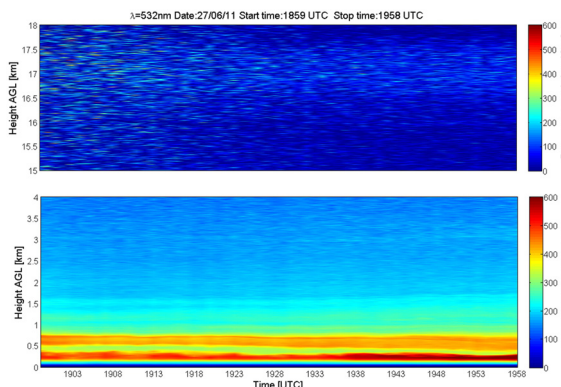
## 6. FIGURES



**Figure 1. Comparison among analog, PC, and glued signals. (Blue) Analog raw signal,  $\vec{V}_a$ . (Red) Scaled-and-offset analog signal,  $\vec{V}'_a = a\vec{V}_a + b$ . (Black dotted) PC signal. (Green) Glued analog-PC signal. Note that below 2.6km (corresponding to a 10-MHz count in the PC channel) the glued signal follows the analog signal while above this range it follows the PC signal.**



**Figure 2. Time series monitoring the evolution of a vertical profile of volcanic aerosols in the stratosphere (about 17km) and several Saharan dust layers in the troposphere (below 3.5km), 532nm channel. (a) Range-corrected profile for the glued signal. (b) Glued signal time series.**



**Figure 3. Glued signals zoomed in the low range (0-4 km) and in the far range (15-18 km).**