TIME-AVERAGE-BASED METHODS FOR MULTI-ANGULAR SCALE ANALYSIS OF COSMIC-RAY DATA

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ABSTRACT

Over the past decade, a number of experiments dealt with the problem of measuring the arrival direction distribution of cosmic rays, looking for information on the propagation mechanisms and the identification of their sources. Any deviation from the isotropy may be regarded to as a signature of unforeseen or unknown phenomena, mostly if well localized in the sky and occurring at low rigidity. It induced experimenters to search for excesses down to angular scales as narrow as 10°, disclosing the issue of properly filtering contributions from wider structures. A solution commonly envisaged was based on time-average methods to determine the reference value of cosmic-ray flux. Such techniques are nearly insensitive to signals wider than the time window in use, thus allowing us to focus the analysis on medium- and small-scale signals. Nonetheless, the signal often cannot be excluded in the calculation of the reference value, which induces systematic errors. The use of time-average methods recently revealed important discoveries about the medium-scale cosmic-ray anisotropy, present both in the northern and southern hemispheres. It is known that the excess (or deficit) is observed as less intense than in reality and that fake deficit zones are rendered around true excesses because of the absolute lack of knowledge a priori of which signal is true and which is not. This work is an attempt to critically review the use of time-average-based methods for observing extended features in the cosmic-ray arrival distribution pattern.

Key words: astroparticle physics – cosmic rays – ISM: magnetic fields – methods: data analysis – surveys

Online-only material: color figures

1. INTRODUCTION

Large field-of-view (FOV) experiments operated for cosmicray (CR) physics collect huge amount of high-quality data, making possible the study of CR arrival distribution with remarkable detail. Either satellite-borne or ground-based detectors are considered, and many collaborations coped with the measurement of the CR intensity all over the portion of the sky they observed. They all looked for deviations from the isotropic distribution, as any signature of anisotropy provides essential information on CRs and the medium that they propagate through.

Apart from the search for gamma-ray emission from pointlike (or *quasi*-point-like) sources, either in the MeV energy range on board satellites or in the TeV region with groundbased telescopes, directional data are analyzed to map the CR gradient all over the sky at every angular scale.

Signal as deviation from the isotropy. Any motion of the laboratory system with respect to the CR plasma turns to a dipolar signature with a maximum in the direction of the motion. This is true for any "still system" we consider: it might be well the solar system (i.e., the motion of the Earth around the Sun is factorized) or the Galaxy itself (the motion of the solar system around the Galaxy center is factorized). Such a process of dipole generation is commonly referred to as the "Compton–Getting" effect (Compton & Getting 1935) and was observed by a number of experiments (Aglietta et al. 1996; Amenomori et al. 2004, 2007; Abbasi et al. 2011). In this last case, as the amplitude and the phase of the signal are analytically predictable, the observation is commonly considered as the starting point of any anisotropy analysis, as it demonstrates the reliability of the detector and the analysis methods to be fine-tuned. Concerning the "galactic" Compton-Getting effect, the importance of this measurement lays in determining whether the CR plasma is comoving or not with the "still system" under study (Amenomori et al. 2006).

Moving to narrower scales, it is known that a CR "pure" anisotropy, i.e., not due to expected Compton–Getting effects, exists down to angular scales as wide as $\sim 60^{\circ}$. It has been observed by ground-based detectors since the 1930s and most recent experiments represented it in two-dimensional sky-maps (see Iuppa 2012 and references therein). Such a "large-scale" anisotropy (LSA) is of fundamental importance, commonly interpreted as a signature of the propagation of CRs in the local medium.

As charged particles, CRs have trajectories deflected by magnetic fields so that their rigidity sets up a "magnetic horizon," i.e., a distance below which the observed arrival distribution contains information about the interaction of CRs with the medium through which they propagate. The diffusion approximation effectively explains the observations beyond this horizon. Thus, GeV-TeV CRs are an effective tool to probe magnetic fields within the solar system (up to the heliotail; Desiati & Lazarian 2012). The multi-TeV region is important to study the CR propagation in the local interstellar medium (LISM), whereas higher energy CRs may reveal important features of the galactic magnetic fields. If electrons $(e\pm)$ are considered, synchrotron energy losses should be accounted for in defining the magnetic horizon (remarkably closer than for protons of the same rigidity). Apart from that, the line is the same and gives the importance of any attempt to measure the anisotropy even in the $e\pm$ channel. The CR electron anisotropy was recently searched for by the Fermi experiment (Ackermann et al. 2010), though with null result.

Since 2009, "medium-scale" anisotropy (MSA) structures were observed in the CR distribution down to angular scales as wide as 10°, although their origin is still unexplained (CR source region, magnetic structures focusing CRs, etc; Amenomori et al. 2007; Abdo et al. 2008a; Iuppa et al. 2012a). They were observed both in the northern and southern hemispheres at TeV energy and they do not appear to be correlated with each other. The narrower

the structures, the closer their origin, which explains the growing interest toward this phenomenon (Desiati & Lazarian 2012; Drury & Aharonian 2008; Salvati & Sacco 2008; Giacinti & Sigl 2012).

Besides these CR signals, diffuse gamma-ray emission is often measured by satellite experiments in the GeV range (Ackermann et al. 2012) and extensive air-shower (EAS) arrays observed the diffuse emission from the Galactic plane at TeV energy (Abdo et al. 2008b). Structures as wide as 10° – 20° must be properly extracted from the background (the overwhelming CR contribution or the average photon content) and the analysis methods used to do that often rest on the same ideas exploited to measure the CR anisotropy.

Detection techniques. Considering either the CR anisotropy or the diffuse emission from the Galactic plane, the experimental issue of properly detecting and estimating the intensity of a signal as bright as 10^{-4} to 10^{-3} with respect to the average isotropic flux of CRs must be dealt with.

It translates in estimating the exposure of the detector with accuracy well below that threshold, to avoid detector effects that mimic signals due to physics. Keeping the exposure map under control down to $\sim 10^{-4}$ is a challenge even for the most stable experiment, as unavoidable changes in the operating conditions occur and online corrections cannot always be readily applied. For both satellite experiments and ground-based detectors, the envisaged solution is to estimate offline the exposure, relying on statistical methods applied to the large data set available.

Good results can be achieved by combining Monte Carlo simulations and the record of the operating conditions (see, for instance, Ackermann et al. 2012). Otherwise, if simulations do not reach the needed accuracy, such as EAS experiments,³ or in order to obtain a simulation-independent result, the exposure is estimated from data by exploiting some (assumed) symmetries in the data acquisition.

A number of data-driven methods for estimating the exposure exist, although all of them are based on geometrical properties of the detector acceptance (see, for instance, the "equi-zenith" methods; Amenomori et al. 2005) and/or on the uniformity of the trigger rate within a certain period (Alexandreas et al. 1993; Fleysher et al. 2004). As well pointed out by Fleysher et al. (2004), these symmetries are *assumed* to be valid in some conditions and such an assumption is part of the null-hypothesis against which signals are tested.

Among all the techniques that experimenters developed to estimate the exposure, this paper focuses on those based on the time average of collected data. Whatever its particular implementation, any time-average method (TAM) relies on the assumption that in order for the signal to be interpreted as background, it can be filtered out by averaging the event rate in a certain time window. The time average can be performed directly, i.e., by integrating the event rate within the time window and then dividing by the window width (*direct integration* method), or by using Monte Carlo techniques. In the latter case, each event is associated with a number N of "fake" events having all the same experimental characteristics but different arrival times, sampled according to the measured trigger rate. After "time swapping" (or "shuffling" or "scrambling"), the oversampling factor N is accounted

for and the final result makes this approach equivalent to the direct integration method. Actually, the only difference is that the integration is performed via Monte Carlo instead of directly.

The use of TAMs is favored by the property well known in signal processing for which smoothing out a signal with a tophat kernel as wide as T strongly suppresses signals narrower than T. As a consequence, the smoothed signal will contain only signals wider than T, so subtracting it from the actual signal is the same as saving only contributions from frequencies higher than 1/T. As will be discussed more formally in the following sections, TAMs worked effectively for point-like and quasi-point-like gamma-ray sources, because in these cases a suitable time interval around the source can be excluded from the integration. The time average alongside the excluded region is a quite robust estimation of the exposure—i.e., through a simple scaling with the average trigger rate—of the CR background.

Attention to TAMs has recently increased because of their application to detect medium-scale excesses on top of the largescale CR anisotropy. The Milagro collaboration first tried to "adapt" the direct integration method for studies on small to intermediate scales $(10^{\circ}-30^{\circ}; \text{ Abdo et al. } 2008a)$. The attempt came from the assertion that averaging for a time interval Tcorrespondingly makes the analysis insensitive to structures wider than $15^{\circ} T/1$ hr in right ascension. Afterward, other experiments applied TAMs for anisotropy studies, either to estimate the over-all exposure or to focus the analysis on a certain angular scale (Guillian et al. 2007; Ackermann et al. 2010; Abbasi et al. 2011; Juppa et al. 2012a). In some cases, the property of filtering out larger structures became the main reason why TAMs were used, although no detailed discussion has been made on the potential biases of these techniques in filtering the large-scale structures.

This paper presents a series of simple calculations and observations on the filtering properties of TAMs. As they are applied in a variety of experiments having different operating modes, sky-coverage, and trigger rate stability, a general treatment of the matter is impossible. In order to account for a specific experimental layout, the authors made use of a virtual EAS array similar to the ARGO-YBJ experiment (Bartoli et al. 2011a), whereas to discuss a likely case of underlying large-scale structure the model of the LSA of CRs as given in Amenomori et al. (2007) has been used.

Statistical effects were not considered, i.e., no Poissonian fluctuations around the average event content of each pixel were accounted for. In fact, this contribution is to outline some major potential systematic effects, intrinsic to the application of TAMs, regardless of whether or not the number of events is sufficient to make them visible.

This paper is organized as follows. In Section 2 an introduction on TAMs as exposure estimation methods is given. Section 3 is a brief interlude that demonstrates a consequence of data normalization along the right ascension to be considered for all further discussions, though mostly affecting the $\ell = 1, 2, 3$ components of the signal. In Section 4, the effect of TAMs on the signal to be detected are introduced, mostly for what concerns the reduction of the intensity and the appearance of border effects. Section 5 finally provides quantitative information on the residual contribution from filtered components and the signal distortion due to the method. Some concluding remarks are given in the last section.

 $^{^3}$ The important effect of temperature and pressure variations on the atmospheric depth and, consequently, on the trigger efficiency of EAS arrays cannot be taken into account down to 10^{-4} to 10^{-3} .

2. EXPOSURE CALCULATION WITH TAMS

From an experimental viewpoint, the observation of excess (or deficit) effects at a level of 10^{-4} is a difficult task, because of the intrinsic uncertainty that CR apparatus has to cope with in estimating the exposure. For EAS arrays the atmosphere is part of the detector itself and data must be handled with care to avoid the atmospheric change mimicing a signal somewhere in the sky. For detectors on-board satellites, no atmosphere effects are present but trigger rate variations persist related to changing conditions along the orbit.

In general, assuming that there is an isotropic charged CR flux overwhelming all the other signals, the exposure is estimated by assuming that it is proportional to the integrated CR flux. In this way, the exposure estimation problem is posed as a CR-counting problem.

Hereafter, the number of events collected (or computed) in the solid angle $d\Omega$ centered around $\Omega = (\theta, \phi)$ in the local frame, in the time interval [t, t + dt), will be written as

$$\frac{dN(\Omega, t)}{dt} \left(= \frac{d^2 N(\Omega, t)}{d\Omega \, dt} \right)$$

to lighten the notation.

2.1. Point-like and Quasi-point-like Sources

For point-like or *quasi*-point-like sources, TAMs are usually applied to estimate the exposure (i.e., the expected background CR rate) from a certain direction of the sky. They are an evolution of the elder "on–off" method and rely on the assumption that the CR flux from a given direction Ω in the local reference frame is practically constant during short time periods. In other words, the average count from $\Omega = (\theta, \phi)$ during the interval *T* is quite a good approximation of the CR number N_{cr} :

$$\frac{dN_b(\Omega, t)}{dt} \simeq \frac{d\tilde{N}_b(\Omega, t)}{dt} = \left\langle \frac{dN_{\rm ev}(\Omega, t)}{dt} \right\rangle_{w,T},\qquad(1)$$

where N_b is the actual (unknown) background CR number, \tilde{N}_b is the estimated one, and N_{ev} indicates the number of *measured* events. The average is computed in the time interval *T* and using the kernel function *w*, so that

$$\left\langle \frac{dN_{\rm ev}(\Omega,t)}{dt} \right\rangle_{w,T} = \frac{\int_{t-T/2}^{t+T/2} d\tau \ \frac{dN_{\rm ev}(\Omega,\tau)}{d\tau} w(\tau)}{\int_{t-T/2}^{t+T/2} d\tau \ w(\tau)}.$$
 (2)

If the source contribution is not excluded, the function $w(\tau)$ in Equation (2) is the trigger rate and accounts for overall variations in the acquisition regime:

$$d\tau w(\tau) = d\tau \left[\int_{\text{FOV}} d\Omega \, \frac{dN_{\text{ev}}(\Omega, t)}{dt} \right]_{t=\tau}.$$
 (3)

The integration is carried out numerically, with the direct integration or the time swapping method (see the Introduction).

The following sections of this paper will focus on the role of $dN_{\rm ev}/d\tau$ in the estimate (2), as this quantity is the sum of different contributions and the problem of a proper separation of the signal in the angular domain via TAMs must be approached by considering the time properties of $dN_{\rm ev}/d\tau$. However, before that, two other aspects of Equations (1) and (2) should be made explicit.

- 1. *Time interval.* The quality of the approximation is related to the difference between $N_b(\Omega, t)$ and $\tilde{N}_b(\Omega, t)$ (1), i.e., how representative the time average is of each instant CR flux. If the time window *T* chosen is too wide, the geometrical distribution of the CR arrival directions may significantly change due to atmospheric effects. Some changes in the detector operating regime may have the same effect, making the $dN_{\rm ev}/d\tau$ distribution not uniform.
- 2. Source exclusion. The source contribution should be excluded from the time average. Mathematically, the weight (3) must be replaced by $w_{se}(\tau)$:

$$w(\tau) \longrightarrow w_{\rm se}(\tau) = \begin{cases} 0 & \text{if } \Omega \in D_{\rm src}(\tau) \\ w(\tau) & \text{otherwise} \end{cases}, \qquad (4)$$

where $D_{\rm src}(\tau)$ indicates a confidence solid angle around the source at the time τ .

As far as the time window is concerned, the acquisition of EAS arrays is not stable for periods longer than 2–3 hr, as climatic changes affect either the arrival direction distribution of CR or the detector response to the incoming radiation. There are far minor problems for underground experiments or neutrino observatories where even longer times are used in the literature (up to 24 hr; Abbasi et al. 2011). Nonetheless, time intervals as short as 4 hr or less are also used in some of these cases to extract small-scale signals. Satellite-borne detectors are usually so stable to allow to the authors to shuffle events within the whole data set available (up to few years), so that the analysis does not suffer the pitfalls described below (Ackermann et al. 2010).

About the source exclusion, the solid angle to be excluded around the source is related to the detector angular resolution. A safe choice might be two or three times the average angular resolution *plus the source intrinsic extension*. If a 2° wide source is observed with an angular resolution of 1°, a safe exclusion region of 6°–8° around it can be set. If the region is populated of other known sources, the definition of the exclusion region obviously must be adapted.

For all experiments surveying the sky, the FOV does not coincide with the portion of the celestial sphere to be investigated. They exploit the rotation of the laboratory frame with respect to the sidereal frame to get the project coverage. In this sense, all time spans may be translated into angular intervals measured in the sidereal frame. If the laboratory rotates around the Earth axis (ground-based experiments), time intervals are R.A. intervals. Depending on the rotation of the laboratory frame in the sidereal frame, 1 hr may correspond to $\sim 15^{\circ}$ in R.A. for a ground-based detector or $\sim 240^{\circ}$ in the orbit plane of a low Earth circular orbit satellite. For the IceCube detector at the South Pole, the sky portion observed is always the same and time-flow simply brings a rotation with respect to the celestial coordinates. For ground-based detectors, 2-3 hr correspond to 30° - 45° and enough statistics is left to allow the source exclusion (\sim 50%–80% of the events inside the time window *T* can be used). In the literature, typical values are found to be T = 2 hr for the time interval and $\Delta = 6^{\circ}$ for the exclusion region width (Fleysher et al. 2004; Bartoli et al. 2011b).

2.2. Wider Structures

If wider structures are considered, the two conditions of the previous section cannot be fulfilled *at the same time*. In fact, the off-source integration interval becomes narrower than the source

extension, thus making the on/off source event ratio too high and introducing large fluctuations in the exposure estimation.

This is true for a number of structures having physical extensions wider than few degrees. For instance, when experiments such as Milagro or ARGO-YBJ measure the diffuse emission from the Galactic plane, the source exclusion region is usually a $\pm 5^{\circ}$ Galactic latitude belt around the plane. Studies of systematics are performed by extending the region up to $\pm 10^{\circ}$, obtaining a non-negligible contribution to the uncertainty ($\sim 10\%$; Abdo et al. 2008b). The $\pm 5^{\circ}$ choice gives fewer fluctuations but probably still includes some signal events in the background estimation. On the contrary, the $\pm 10^{\circ}$ is a safer choice for what concerns the source exclusion, at the expense of the statistics.⁴ Quoting this effect as a source of systematics is still acceptable because the experiments do not have the sensitivity to extend the measurement up to 10° -15° from the Galactic plane. Perhaps next-generation experiments will have it and it will not be possible to exclude the whole region of interest when applying TAMs.

A similar point holds for the MSA regions, often wider than 20° , for which the source exclusion is not applicable.

In these cases, the signal intensity is reduced by a factor ρ depending on the signal and the background morphology, as well as on the time window chosen to apply the TAM. For uniform background, uniform source with extension T_S in local hour angle and time window T, it holds $\rho = 1 - T_S/T$.

3. TAMs AND LSA

Before coping with the filtering properties of TAMs, we discuss here the effect of TAMs on the measurement of the LSA of CRs. Actually, no modern experiment except for IceCube used TAMs to estimate the exposure (Abbasi et al. 2011) for all-scale analysis, because it would mean to average along 24 hr and to face all the issues of detector stability addressed in the previous section. Nonetheless, the result reported here is also valid for all the other measurements of the CR anisotropy, e.g., "equi-zenith" (Amenomori et al. 2005) or "forward-backward" (Abdo et al. 2009). In fact, a common device to bypass the ignorance of the absolute detection efficiency as a function of the arrival zenith angle (i.e., of the declination) is to set the average flux of CRs detected in a certain zenith (declination) belt to a certain value, and use the same for all different belts. In other words, deviations from the isotropy are not measured with respect to the average over the whole sky observed, as to do that the efficiency of the detector as a function of the zenith must be properly accounted for. Conversely, the reference average is computed along each zenith belt.

We show here that this solution introduces a degeneracy in the measurement of the anisotropy, i.e., m = 0 components of the signal are suppressed.

If the signal is looked at as a distribution $f(\theta, \phi)$ on the sphere, the act of normalizing the average content of each declination belt to zero can be written as the operator *S*:

$$f(\theta, \phi) \xrightarrow{S} f'(\theta, \phi) = f(\theta, \phi) - \frac{1}{2\pi} \int_0^{2\pi} d\phi f(\theta, \phi)$$

where the f' distribution is the measured one, which differs from the "true" f for the average $\langle f \rangle_{\theta} = 1/2 \int_{0}^{2\pi} d\phi f(\theta, \phi)$. We can

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consider the spherical harmonics expansion of the *f* distribution:

$$f(\theta,\phi) = \sum_{\ell=0}^{\infty} \sum_{m=-\ell}^{\ell} a_m^{\ell} Y_{\ell}^m(\theta,\phi)$$

and considering in a closer detail the effect of the average on the signal. In fact,

$$\int_0^{2\pi} d\phi \, Y_\ell^m(\theta, \phi) = \begin{cases} 0 & \text{if } m \neq 0\\ Y_\ell^m(\theta, \phi) & \text{if } m = 0 \end{cases}.$$

Using the last result, f' can be rewritten as

$$f'(\theta,\phi) = f(\theta,\phi) - \sum_{\ell=0}^{\infty} a_0^{\ell} Y_{\ell}^0(\theta,\phi),$$
 (5)

where the degeneracy is made explicit. In fact, all terms with m = 0 are suppressed by the experimental technique applied, what is more important as the multipole order ℓ gets lower.

If the sky is only partially observed, further effects arise due to the non-uniform exposure. In fact, if the number of events strongly depends on the declination or other preferred directions, significant deviations from isotropy might be observed only in certain regions of the FOV.

A representation of the effect just described is given for $\ell = 1, 2$ in Figures 1 and 2.

4. FILTERING PROPERTIES OF TAMs

As time is a synonym for R.A., TAMs average signals along the R.A. direction, i.e., they enjoy the property of filtering out large-scale contributions to the signal.

If we have a data series x_k (k = 1, 2, ..., N) and we compute for each point the average:

$$\xi_n = \frac{1}{N} \sum_{k=n-N/2}^{n+N/2} x_k \quad (N \leq \mathcal{N})$$
(6)

 $k = k \pm N$ if k < 1 or k > N), then the difference $x - \xi$ will maintain intact all structures narrower than N, whereas all features much wider than N will be suppressed. In Figure 3 we show the results of a toy numerical estimation of the timeaverage effect on the signal intensity estimation for different angular scales. The red curve clearly shows that the average along ΔT preserves signals on narrower angular scales and strongly reduces wider contributions. Figure 3 triggers some other considerations. First the excess (or the deficit) is observed as less intense than it really is. This bias can be avoided by excluding the source region, which is impossible for structures wider than half the time-window extension. A second important issue (related to the first one) is that fake deficit zones are rendered around true excesses and, vice versa, fake excesses are seen around true deficits. The importance of this problem lays in the absolute lack of knowledge a priori of which signal is true and which is not. The problem is present mostly for structures coming from reducing wider features than for really narrow signals. If the actual signal is well separated in the harmonic space from the wider structure to be suppressed, it may be possible to observe it also without any filter, i.e., just by considering the R.A. distribution like in Abdo et al. (2008a). On the other hand, if some hypothesis can be made (from the literature or from independent data about the detector exposure), the effect of such underlying larger-scale signals can be easily estimated and quoted as systematic uncertainty of the final measurement.

⁴ Note that $\pm 10^{\circ}$ in Galactic latitude corresponds to a varying R.A. interval, as the Galactic plane is not oriented along the celestial equator.

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Input map

Figure 1. Effect of the R.A. normalization on a dipole signal. Figure 1(a) represents the input dipole signal, as intense as 0.1. The dipole vector points at $(\theta = 63^\circ, \phi = 243^\circ)$. Figure 1(b) represents the dipole reconstructed with methods normalizing the average content in each decl. belt to zero. The dipole vector points at $(\theta = 90^\circ, \phi = 243^\circ)$ and the intensity is 0.089. Figure 1(c) represents the difference between the input map and the reconstructed one, which turns out to be a dipole as intense as 0.045, pointing at $\theta = 0^\circ$. Note that $0.089^2 + 0.045^2 = 0.1^2$.

(A color version of this figure is available in the online journal.)

5. TAMs AND MSA

The study of the MSA in the arrival distribution of CR can be approached with different methods.

Likely the most orthodox way is to evaluate the exposure with techniques sensitive to any angular scale and then apply the spherical harmonics analysis to filter out the signal. The use of the $a_{\ell m}$ coefficients prevents any contamination from harmonic regions other than those selected with the (ℓ, m) numbers and allows us to define the degree of anisotropy in a (mathematically) robust way.

Figure 2. Effect of the R.A. normalization on a quadrupole signal. Figure 2(a) represents the input quadrupole signal. Figure 2(b) represents the quadrupole reconstructed with methods normalizing the average content in each decl. belt to zero. Figure 2(c) represents the difference between the input map and the reconstructed one, which turns out to be proportional to the $Y_0^2(\theta, \phi)$ function. (A color version of this figure is available in the online journal.)

Another approach, still starting from an all-scale-sensitive estimation of the exposure, is to estimate the dipole and quadrupole components of the measured CR distribution, to subtract them from the experimental distribution, and to focus on the residuals at scales less than 90° . For such narrower signals, the analysis is carried out in the real domain.

These two methods enjoy the uncontested feature of properly filtering the signal from scales larger than or equal to 90°, although some problems exist due to the partial coverage of the sphere by the experimental data. In fact, either the $a_{\ell m}$ expansion or the dipole–quadrupole determination are achieved with fit procedures over the whole sphere: the part of the sky that is devoid of data must be suitably masked and the lack of information unavoidably reflects upon the error associated with the intensity and the structure position on the sphere.



Figure 3. Simulation of the effect of the time average on the estimate of the intensity of signals of different angular extensions. The central highest signal peaks around 12 hr, another signal is visible in the spike around 15 hr and is represented by the blue curve in the zoom (b). One more signal, around 20 hr, is also represented in the zoom (c). Black curve: sum of all the signals. Red curve: the signal of the black curve as it would appear after the application of a 3 hr wide TAM. Blue curve: input signal centered at R.A. = 15 hr.

(A color version of this figure is available in the online journal.)

Moreover, both the $a_{\ell m}$ and the dipole–quadrupole methods rely on an estimation of the exposure all over the angular scales, which implies that they can filter out the LSA *only* if it is properly detected. If the all-scale analysis revealed some systematics for the LSA, it would be difficult to make sense from an $a_{\ell m}$ expansion of such a signal.

On the other hand, we already hinted that the application of time-average techniques to obtain the MSA signal would introduce systematics on the flux estimation, as well as the bias of filtering *only* along the R.A. direction.

Nevertheless, two arguments are in favor of these techniques:

- They do not inherit systematics from effects present below the angular scale they are set to filter out. In this sense, no Compton–Getting interference is expected, either influence or artifacts induced by large-scale atmospheric effects, which instead were demonstrated to be relevant for the LSA analysis; in fact, systematics introduced in misinterpreting the detector performance usually affect the whole sky, being hardly responsible for localized features;
- 2. The amplitude of the systematics described above, i.e., the residuals from the LSA structures, can be evaluated with Monte Carlo simulations if independent measurements or robust models are available.

5.1. Residuals of Underlying Large-scale Structures

Before considering how TAMs reconstruct extended signals like the MSA, i.e., which effects the analysis technique has on the intensity and the shape of the signal under observation, it is worth investigating the residual effect of the underlying large-scale structures, which are strongly suppressed by the time average.

Signal gradient along the RA direction. The result of the TAM depends on the signal to which it is applied, so that no prediction is possible if the signal *in toto* is not considered. Nonetheless, it is convenient to focus on two characteristics of the signal separately, i.e., the extension and the gradient along the R.A. direction. It is easy to assess that the gradient of the estimated background is proportional to the difference of the *signal* gradient at the boundaries of the time-average window:

$$\frac{d}{dt} \left\langle \frac{dN_{\text{ev}}(\Omega, t)}{dt} \right\rangle_{w,T}$$

$$\simeq \frac{k}{T} \left(\frac{dN_{\text{ev}}(\Omega, \tau)}{d\tau} \bigg|_{\tau=t+T/2} - \frac{dN_{\text{ev}}(\Omega, \tau)}{d\tau} \bigg|_{\tau=t-T/2} \right).$$
(7)

The constant k depends on the kernel function used.⁵ In the numerical implementation, if a "top-hat" kernel is used, it

⁵ It must be symmetric in time, i.e., $w(\tau) = w(-\tau)$.



Figure 4. Toy-calculation to highlight the relevance of the gradient along the R.A. direction of the signal under study. Top panel: a 6 hr wide signal as intense as 10^{-3} with respect to the underlying flat background was simulated to rise up with different slope; bottom panel: the signal as reconstructed after the TAM-calculated background subtraction (time window: 3 hr).

(A color version of this figure is available in the online journal.)

turns out to be k = 1. The equality does not hold because of the denominator in Equation (2), introducing second-order corrections in $dN_{ev}(\Omega, t)/dt$. Equation (7) can be solved by thinking of a discrete implementation of the TAM, where a moving time window passes from the *i*th time bin to the (i + 1)th. The content of the bin centered at $t_{i+1} + T/2$ is included in the background estimation in place of the content of the bin centered at $t_i - T/2$.

A simple representation of this effect is given in Figure 4. The top panel represents a large-scale excess as intense as $I = 10^{-3}$ with respect to the isotropic CR flux, drawn according to the equation:

$$\frac{dN_{\rm ev}(\Omega, t)}{dt} = \frac{I}{2} \left[\tanh\left(\frac{t - \alpha_0 + \Delta\alpha/2}{w}\right) - \tanh\left(\frac{t - \alpha_0 - \Delta\alpha/2}{w}\right) \right].$$

The signal center is fixed at $\alpha_0 = 12$ hr, the width at $\Delta \alpha = 6$ hr, and the signal gradient constant 1/w changes from ∞ to 1/1.5 hr⁻¹ (black to green curves). The bottom panel reports how a TAM (top-hat kernel, time window: 3 hr) would filter each signal of the panel above. Residuals of the large-scale signal remain, whose intensity strongly depends on the signal gradient. For a non-physical signal like the black one (w = 0), border effects as intense as half the input signal are visible. These effects are reduced below 10% of the input intensity if the signal gradient along R.A. is less than 1 hr⁻¹. It can be noticed that residuals are of both positive and negative natures.

The maximum intensity of the residuals and their extension (intended as the width of the intervals wherein they are always above or below 5% of the input signal intensity) are reported in Table 1. Note that the width is never above 3 hr, i.e., the time window used in the analysis.

The effect of the LSA on the time-average exposure estimation. In the last section it was shown how important is the gradient of the large-scale signal intended to be filtered out with TAMs. Results were given for a toy-calculation with the purpose of enhancing potential biases of the analysis.

The aim of this section is to evaluate the effect of the residual contribution of a large-scale signal whose nature is closer to reality. Once again, the result was achieved with numerical calculations, and the algorithm applied is described in the following.

 Table 1

 Intensity and Extension of Residuals Reported in the Bottom Panel of Figure 4

Signal Gradient (hr ⁻¹)	Amplitude of Residuals $(\times 10^{-4})$	Width of Residuals (hr)	
$\overline{\infty}$	5.0	1.5	
1/0.25	3.3	1.7	
1/0.5	2.2	2.2	
1	1.0	3.0	
1/1.5	0.5	3.0	

LSA parameterization. To avoid introducing any circular bias, we used the parameterization of the LSA given by the Tibet-AS γ collaboration in Amenomori et al. (2010). The authors model their observation with two structures: a global and a medium anisotropy. The former signal is what is commonly referred to as LSA, whereas the second one lies on smaller scales and is part of the signal for which the methods discussed in this paper are tuned. It is worth noting here that the best fit of the model (Amenomori et al. 2010) is given after the normalization of data along each declination band (see Section 3).

Exposure simulation. The detector exposure was simulated by using the local CR distribution obtained for a flat groundbased detector, with a standard atmosphere absorption model $(dN/d\theta = I_0 \exp(-k/\cos\theta)$, with k = 4.8). After time discretization, the local CR distribution was computed for each time bin in the sidereal day and transposed in equatorial coordinates. The exposure map showed the characteristic feature of a maximum at a decl. few degrees above the experiment latitude (30° N), fading away at the FOV decl. limits. As the calculus was performed with events arriving within $\theta = 50^{\circ}$, the reference decl. band for this analysis is $-20^{\circ} \leftrightarrow 80^{\circ}$.

Event simulation. As previously noted, in order to exclude uncertainties due to statistics, the *event map* was not filled by following a Poissonian distribution, but using the average value expected from the numerical integration of the local distribution function. This is why no fluctuations are visible in the R.A. profile. The *actual background map* was obtained with the same solution: to avoid any fluctuations, any pixel was filled with the product of the exposure times the total number of detected events.

Estimated background. The estimated background map was obtained from the event map, i.e., from the sky picture *containing* the LSA signal. The content of each pixel was replaced with the average content of all pixel less distant than T/2. The TAM was repeated for all values of T from 1 to 24 hr. Results for 1, 2, 3, 4, 6, 12, and 24 hr will be reported only.

The Healpix "ring" pixelization scheme was used (Gorski et al. 2005).

Anticipating Section 5.2, we note that the angular distance between pixels is the same throughout the sphere, but the R.A. distance increases when the pixels under consideration are close to the poles. Consequently, as the interval for the average is set in the R.A. space, the computation at low decl. values is carried out on more pixels than at higher decl. The methods becomes ineffective when the number of pixels at a certain decl. is such that the average along a certain ΔT is the pixel itself, making the background equal to the signal. The effect is small for decl. $\delta < 45^\circ$ and T > 3 hr = 60°, but is important above $\delta = 70^\circ$, mostly for $T \leq 2$ hr.

Figure 5 reports the result of the calculus for different decl. bands. The plots were obtained by projecting data of the event map $(dN_{ev}/dt$ abbreviated with *e* in the figure) and the



Figure 5. LSA simulation for different decl. bands: (a) $-20^{\circ} \leftrightarrow 0^{\circ}$; (b) $0^{\circ} \leftrightarrow 20^{\circ}$; (c) $20^{\circ} \leftrightarrow 40^{\circ}$; (d) $40^{\circ} \leftrightarrow 60^{\circ}$; (e) $60^{\circ} \leftrightarrow 80^{\circ}$. Different curves represent different time-average windows (see the legend for details).

(A color version of this figure is available in the online journal.)

estimated background map $(d\tilde{N}_b/dt \rightarrow b)$ in the declination interval indicated, then by calculating for each bin the ratio (e-b)/b. In every plot, the black curve represents the input LSA signal after the R.A. normalization. As no detector-induced effects or statistical fluctuations are considered, the gray curve perfectly fits with it, representing the signal as it would be observed with an all-scale-sensitive TAM (T = 24 hr). The other curves represent what remains of the LSA structure when the *T*-wide filter is applied. It can be appreciated how the LSA is practically suppressed for $T \leq 4$ hr. Table 2 reports the absolute maximum deviation of the LSA-induced signal from the zero-reference-value as a function of the decl. band and the time-average window, in units of 10^{-4} . It is worth noting that the maximum effect occurs at the maxima of the LSA, so that for medium-scale structures observed in other regions than those maxima, such an effect is far less than reported in Table 2.

Figure 5 shows how weak the effect of the LSA is when structures narrower than 45° are looked for. If the numbers of Table 2 are considered, together with the typical intensity quoted for the MSA emission (4×10^{-4} to 10^{-3} relative to CR isotropic flux, with $T \leq 3$ hr; Abdo et al. 2008a; Iuppa et al. 2012a; Abbasi et al. 2011), systematic residuals from the LSA after the TAM are proved to be less than 20%.

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Table 2						
Systematic Error Induced by the Time-average Filtering Method						
Used in the Analysis						

Decl. Band	Systematic Error $(\times 10^{-4})$					
	1 hr	2 hr	3 hr	4 hr	6 hr	
$-20^{\circ} \leftrightarrow 0^{\circ}$	0.07	0.29	0.7	1.1	2.4	
$0^{\circ} \leftrightarrow 20^{\circ}$	0.06	0.26	0.6	1.0	2.1	
$20^{\circ} \leftrightarrow 40^{\circ}$	0.05	0.20	0.4	0.8	1.6	
$40^{\circ} \leftrightarrow 60^{\circ}$	0.04	0.14	0.3	0.5	1.1	
$60^{\circ} \leftrightarrow 80^{\circ}$	0.016	0.06	0.14	0.25	0.5	

Note. The LSA was parameterized according to the "global anisotropy" given in Amenomori et al. (2010).

5.2. Reconstruction of MSA Structures

As the signal to be resolved is not excluded in the background computation, distortions will appear in its reconstruction. From the previous section it should be clear that the effect of the TAM depends on the actual shape of the event distribution, whose composition is not known a priori, i.e., the signal and background are not known. After considering how the underlying wider structures affect the analysis, we describe here the relation between the actual and reconstructed signals. The results are obtained by considering a top-hat one-dimensional signal to which TAMs with different time windows are applied. The background is assumed to be constant, which is equivalent to assuming that the larger-scale structures are well separated in the harmonic space from the MSA. In this sense, it should be noted that the calculation is the same as that reported in the study of the R.A. gradient, with the important difference that the ratio of the signal width to the time window was greater than 1 there, but it is smaller here.

The issue of the actual angular size of the signal and that of the reduction of the intensity are addressed.

Signal extension and declination. If it is true that time is the same of R.A., so that time average corresponds to R.A. average, it does not mean that the filtering properties of TAMs are the same all over the sphere. In fact, the angle ψ between two events having coordinates (α_1 , δ) and (α_2 , δ) depends on δ :

$$\cos \psi = \sin^2 \delta + \cos^2 \delta \cos(\alpha_1 - \alpha_2). \tag{8}$$

Equation (8) clearly shows the dependence of ψ on δ (as expected, $\psi = 0^{\circ}$ if $\delta = 90^{\circ}$). As a consequence, the effect of any filter working in the R.A. space will be different according to the declination band: a top-hat filter 45° wide in R.A., corresponds to a top-hat filter $31^{\circ}4$ wide. A representation of Equation (8) for $\alpha_1 - \alpha_2 = 45^{\circ}$ is given in Figure 6.

This is the reason why TAMs tend to return increasingly narrow structures as declination bands farther from $\delta = 0^{\circ}$ are considered.

Signal reduction. We consider a signal with intensity dN_s/dt and width w (in R.A.), above a flat background with intensity dN_b/dt . It is analyzed with a TAM with time window T. The (measured) event content is indicated with dN_e/dt . The reconstructed signal a'

$$a' = \frac{dN_e/dt - dN_{b'}/dt}{dN_{b'}/dt}$$

can be compared with the actual one

$$a = \frac{dN_e/dt - dN_b/dt}{dN_b/dt} = \frac{dN_s/dt}{dN_b/dt}$$



Figure 6. Angular distance between two points on the sphere having R.A. coordinates shifted 45° from each other, as a function of the declination. The vertical lines enclose the declination region for which many computations of this paper were made.

(A color version of this figure is available in the online journal.)

by studying the ratio $\alpha = a'/a$. The ratio will depend on the ratio $\rho = w/T$ and on *a* itself. It is easy to demonstrate that for $0 < \rho \le 1$ and $\rho a \ll 1$ (conditions fulfilled for the measured MSA intensity) it holds:

$$\alpha \simeq (1 - \rho)(1 + \rho a) \simeq 1 - \rho, \tag{9}$$

i.e., the reduction of the signal intensity depends linearly on the ratio ρ .

Equation (9) makes explicit one of the major uncertainty induced by TAMs: since the signal width is something to be determined, the choice of the time window to be used must be externally directed (i.e., after experimental trials or other measurements from literature). It is worth recalling that relation (9) is obtained for a particular (and non-physical) case and it gives an upper limit of the dependence of the signal reduction on the quantities ρ and α .

6. CONCLUSIONS

This paper is intended to contribute to the study of the analysis methods implemented to observe extended signals in the CR arrival direction distribution. In particular, it focuses on the time-average-based methods applied when the source cannot be excluded, and it points out how they undoubtedly enjoy properties of filtering in the R.A. direction, at the expense of important spurious effects introduced in the signal reconstruction, for both what concerns its intensity and its shape. Experiments such as Milagro, IceCube, and ARGO-YBJ made use of these methods in the past decade (Abdo et al. 2008a; Iuppa et al. 2012a; Abbasi et al. 2011).

On the important point of potential residual effects coming from larger signals, which are supposed to be filtered out, it has been shown that they depend on the gradient of such signals, rather than on their intensity, which makes the bias from the known underlying LSA very small.

Known distortions of the reconstructed signal were analyzed, giving numerical information about the intensity reduction, the presence of border effects (deficits around excesses and vice versa), and a sort of "reshaping" due to the filter acting only along the R.A. direction.

We conclude that the detection of medium and small structures with TAMs may hardly mimic fake signals more intense than 2×10^{-4} with respect to the average isotropic CR flux. Nonetheless, if more detailed studies are attempted, such as energy spectrum (i.e., signal intensity) or morphology, care is needed in considering systematic effects introduced by TAMs. In the near future, experiments (Abbasi et al. 2011; Abeysekara et al. 2012; Cao 2010) will have the sensitivity to go below the 10^{-4} level, which will make the choice of TAMs increasingly less effective.

In this sense, medium- and small-scale CR anisotropy are best searched for if a full-scale analysis is applied, with standard spherical harmonics or wavelet techniques (Iuppa et al. 2012b) allowing the authors to focus on well-defined regions in the harmonic space. The possibility of this approach is related to the capability of controlling the detector exposure down to the level of the signal to be observed, i.e., accounting for detector and environment effects as precisely as 10^{-4} to 10^{-3} . Because of this, TAMs, if carefully implemented, can still be considered a good compromise for current experiments, which are controlled to this level but do not yet have the sensitivity to detect signals as low as 10^{-5} .

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