

# Solar Particle Energy Spectra by Application of Regularization Methods

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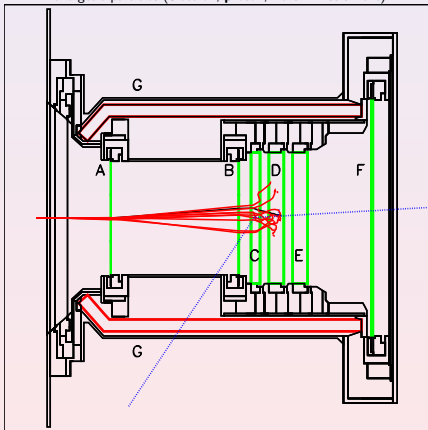
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# The EPHIN in the GEANT 4 simulation

## EPHIN Sensor

One of the experiments on SOHO is the sensor **EPHIN**, devoted to measure solar energetic particles (**e**lectron, **p**roton, **h**elium **i**nstrument)



Side view of the sensor, a tube, consisting of active detectors, 6 Si-solid state detectors **A**, **B**, **C**, **D**, **E**, **F** (in green) and an anticoncidence scintillator **G** (in red), providing information on energy loss. Included are 10 tracks of 5 MeV electrons (MC-simulation)

Measuring channels are defined with requirements on energy deposit and range of particles, four **E**-channels, mainly detecting electrons, and four **P**-channels, mainly detecting protons.



## Regularization

The Eq.(1) is the Fredholm integral equation of the first kind and after the discretization one must solve the singular or ill-conditioned system of linear algebraic equations

$$\mathbf{A}f = z, \quad (1)$$

where  $\mathbf{A} \in R^{m \times n}$  is a matrix with elements  $a_{ij}$ ,  $f \in R^n$  and  $z \in R^m$  are vectors. Using the singular value decomposition (SVD) method we have the minimum norm solution of least squares problem

$$f_{svd} = \mathbf{A}^+ z = \mathbf{V}\Sigma^+ \mathbf{U}^* z. \quad (2)$$

The iterated Tikhonov regularization method

$$f_{k+1} = f_k + (\mathbf{A}^* \mathbf{A} + \alpha \mathbf{I})^{-1} \mathbf{A}^* r_k \quad \text{with} \quad r_k = z - \mathbf{A} f_k \quad (3)$$

$f_0 = 0$  gives the solution  $f_{tikh}$ , that is completely congruent with the solution  $f_{svd}$ . The nonnegative solution  $f_{opt}$  we obtain by the optimization with constrains

$$y(f) = \min \sum_{i=1}^m \left( \frac{z_i - \sum_{j=1}^n a_{ij} f_j}{s_i} \right)^2 \quad \text{subject to } f_i \geq 0 (i = 1, \dots, n). \quad (4)$$

and with  $s_i^2 = z_i$ .  $f_{tikh}$  or  $f_{svd}$  is used as the starting value for this minimization problem.



## Integral Equation

To derive the energy spectrum  $I(E_{beam})$  from experimental data  $I(E_{deposit})$  the integral equation

$$I(E_{deposit}) = \int \mathbf{K}(E_{deposit}, E_{beam}) \cdot I(E_{beam}) \cdot dE_{beam} \quad (1)$$

has to be solved. The kernel  $\mathbf{K}$  can be derived from a Monte Carlo simulation of the sensor response

$$I(E_{deposit}) \cdot dE_{deposit} = \int (dF \cdot d\Omega \cdot dE_{beam} \cdot \epsilon(x, y, \theta, \phi, E_{beam}, E_{deposit})) \cdot dE_{deposit} \quad (2)$$

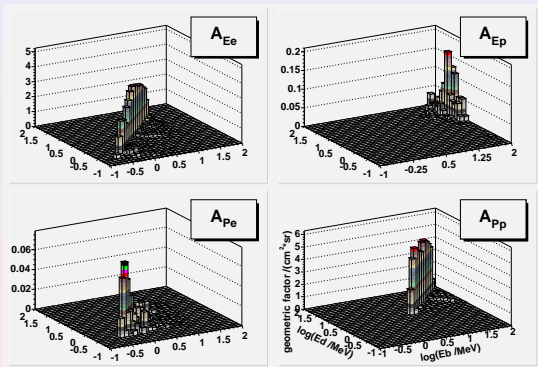
The kernel  $\mathbf{K}$  is

$$\mathbf{K} = \int dF \cdot d\Omega \cdot \epsilon(x, y, \theta, \phi, E_{beam}, E_{deposit}) \quad (3)$$

where  $\epsilon$  is the efficiency to detect a solar particle with energy  $E_{beam}$  within the interval  $dE_{beam}$ , generating the energy deposit  $E_{deposit}$ , within the interval  $dE_{deposit}$ , when arriving in the area element  $dF$  at position  $(x,y)$  and in the solid angle element  $d\Omega$  from direction  $(\theta, \phi)$ . The detection efficiency  $\epsilon$  and  $\mathbf{K}$  is calculated via the Monte Carlo technique, usually assuming an isotropic angular distribution of the beam, with a uniform distribution on the sensor area.



## EPHIN kernel



Geometric factor in dependence on  $E_{beam}$  and  $E_{deposit}$  in the **E**-channels and the **P**-channels, from a Monte Carlo simulation of the EPHIN instrument

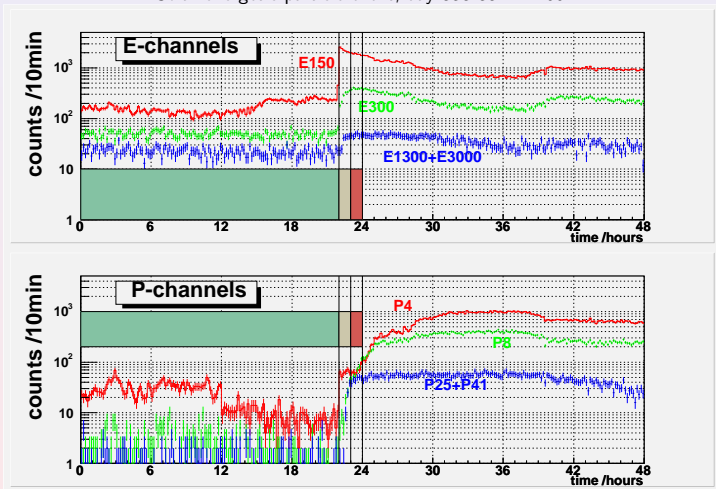
The Eq.(3) is considered in the following common form

$$\begin{pmatrix} A_{Ee} & A_{Ep} \\ A_{Pe} & A_{Pp} \end{pmatrix} \begin{pmatrix} f^{(e)} \\ f^{(p)} \end{pmatrix} = \begin{pmatrix} z^{(E)} \\ z^{(P)} \end{pmatrix}$$

with the matrices plotted in the graphic,  $f^{(p)}(E_{beam})$  and  $f^{(e)}(E_{beam})$  describe the proton and the electron spectrum respectively, leading to the observed  $z^{(P)}(E_{deposit})$  and  $z^{(E)}(E_{deposit})$  distributions.



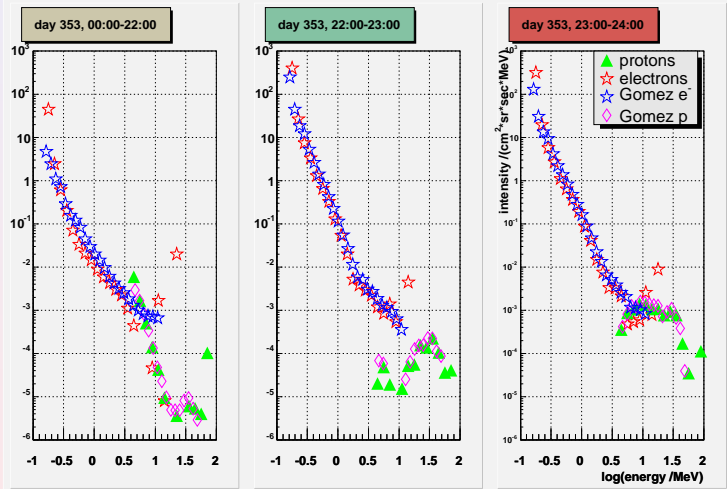
## Solar energetic particle event, day 353-354 in 2002



time propagation of countrate during solar energetic particle event, starting on day 353/2002 at about 22.30 in time in the E-channels, a bit later in the P-channels



particle energy spectra at selected times

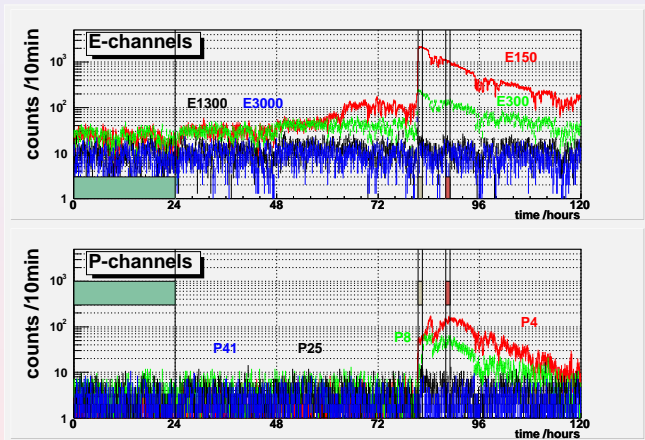


proton and electron flux on day 2002/353 from the present analysis together with results from Gomez obtained by another method





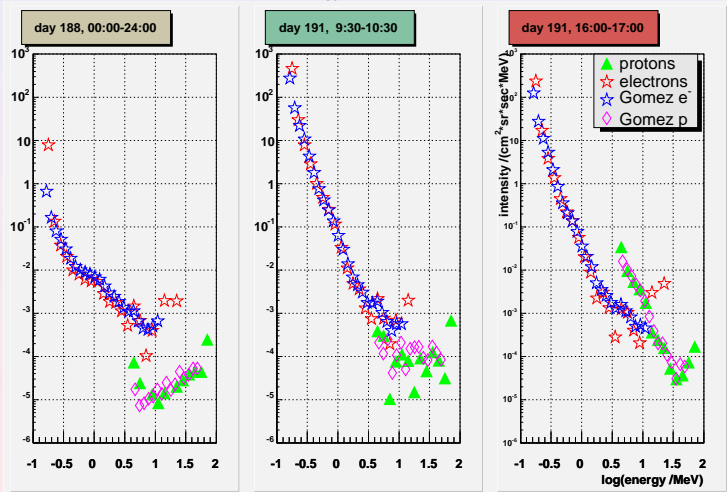
## Solar energetic particle event, day 188-192 in 1996



time propagation of countrate during solar energetic particle event, starting on day 188-192 1996 at about 9.30 in time on day 191 in the E-channels, a bit later in the P-channels



particle energy spectra at selected times



proton and electron flux on day 188-192 in 1996 from the present analysis together with results from Gomez obtained by another method



## Conclusion

The analysis of experimental data is simplified and obtained in a more general way by solving the Inverse Problem.

No special a priori assumptions on the shape of distributions, as usually applied, and the contribution of various particle types into defined channels can be taken into account.

