# Proton flux analysis and solar modulation with the AMS-02 detector and neutron monitors.

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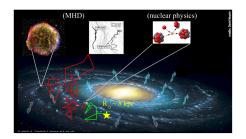
LPSC, Grenoble

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#### Introduction & Motivations

Galactic cosmic rays (GCR) and solar modulation

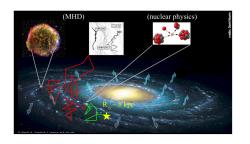


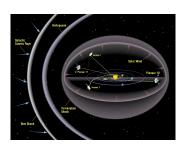
#### Propagation of CRs in the Galaxy

- Synthesis and acceleration.
- Transport in the Galaxy ( $\approx$ 20 Myr).
  - Diffusion on magnetic fields.
  - Energy gains/losses.
  - Nuclear interactions.

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- Synthesis and acceleration.
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#### Solar modulation

- CR interaction with the solar plasma.
- Modulation correlated with the Sun activity (sunspots).
- Time dependent (11 yr cycle).

#### Introduction & Motivations

Galactic cosmic rays (GCR) and solar modulation

#### Motivations

#### Galactic scale:

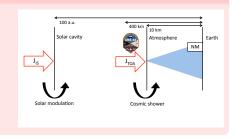
- CR sources (abundances, spectrum).
- CR transport.
- Dark matter.

#### Local scale:

- Interstellar fluxes  $(J_{IS})$  needed for GCR data interpretations.
- Understand solar physics and transport in solar cavity.

#### Which data can be used?

- Top of atmosphere (TOA) CR experiments.
  - ► **AMS-02**, PAMELA, BESS.
- Count rate from ground based experiments.
  - Neutron monitors (NM), muon monitors.



#### Outline

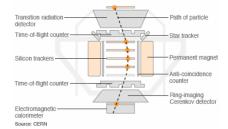
- Introduction & Motivations.
- AMS-02 proton analysis.
  - What is AMS-02?
  - From count rates to flux.
  - Proton selection.
  - Unfolding.
  - Caracterisation of the proton flux.
- Solar modulation study.
  - What is solar modulation?
  - The force field model.
  - What is a neutron monitor?
  - Reconstruction of solar modulation levels.
- Conclusion & Perspectives.

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What is AMS-02?

- On the ISS since may 2011.
  - Continuous data taking.
  - Large statistics (3 × 10<sup>8</sup> protons detected over 30 months).
- Composed of 6 sub-detectors.
  - Multi-purpose detector (from H to Fe + leptons).
  - Redundant measurements of detected particle's properties.
- Core: permanent magnet and silicon tracker.
  - Identify the sign of the particle.
  - Measure magnetic rigidity  $R = \frac{p}{Z} = Br_L$

#### The Alpha Magnetic Spectrometer (AMS-02)

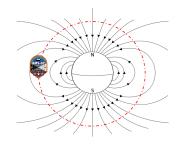


- Very good identification of particles.
- Large acceptance + long duration experiment: huge statistics.

From count rates to flux

$$J_i = \frac{N_i}{Acc_i \times \epsilon_i^{trigger} \times T_i \times \Delta R_i}$$

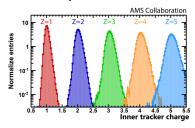
- i: rigidity bin  $[R_i; R_i + \Delta R_i]$ .
- $N_i$ : number of particle detected in rigidity bin i.
- $Acc_i$ : effective acceptance (estimated from MC simulation).
- $\epsilon_i^{trigger}$ : trigger efficiency (estimated from data).
- T<sub>i</sub>: exposure time (from data).



Acceptance from MC, the rest from data.

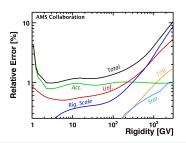
#### Proton selection

- Selection criteria:
  - ▶ Downgoing particles:  $\beta > 0.3$ .
  - ► Charged +1 particles: |Z| < 1.4 and Z > 0.
  - Particle above the geomagnetic cutoff:  $R > 1.4 \times R_{cut}$ .
  - ► Clear signal:  $N_{track} > 0$  and 4/4 ToF layers hit.



Clean selection of proton events.

- Systematic uncertainties.
  - Estimated from MC simulation and in-flight data.
  - ► Syst (4% @1TV) > Stat (0.5% @1TV).

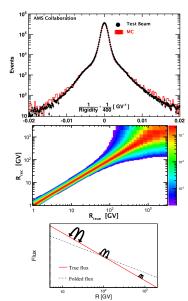


Energy resolution is the dominant source of systematics at high energy.

Unfolding - Problematic

- Finite energy resolution.
  - $ightharpoonup R_{rec} \neq R_{true}$
- Migration matrix (from MC simulation): migration probability.
  - Migration depends on rigidity.
  - Maximum detectable rigidity MDR = 2 TV ( $\Delta R = 100\%$ ).
- Illustration on a power-law flux.
  - Flux distorsion (change of spectral index).
  - Important consequences for data interpretation.

Given AMS-02 data precision, migration has to be corrected



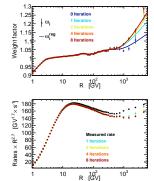
Unfolding - Correction from finite energy resolution [Ghelfi, Proceeding CRISM 2014]

#### Algorithm:

- ▶  $X_j$ : Unfolded rate at the  $j^{th}$  iteration.
- ► Y<sub>i</sub>: Folded rate.
- $ightharpoonup Y_{mes}$ : measured rate.
- ω<sub>j</sub>: weight factor.
- $\omega_j^{reg}$ : regularised weight factor.

$$\begin{array}{rcl} Y_{mes} & = & M \cdot X_{true} \\ Y_j & = & M \cdot X_j \\ \omega_j & = & \frac{Y_j}{X_j} \\ \omega_j^{reg} & = & Spline(\omega_j) \\ X_{j+1} & = & \frac{Y_{mes}}{\omega_j^{reg}} \end{array}$$

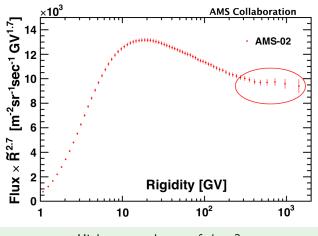
Regularisation: Avoid propagation of statistical fluctuations in the process.



- Fast and robust convergence.
- Validated on simulated data.
- Official method in AMS-02 analysis.

Proton flux

LPSC analysis selected, PRL publication accepted.



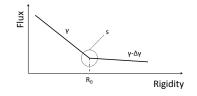
High energy change of slope?

Characterisation of the proton flux

#### Motivations

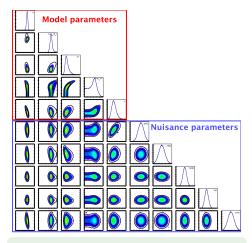
- ► Hint of a break around 200 GV [Adriani et al, 2011], [Yoon et al, 2011].
- ▶ Structure at high energy (source spectrum, transport...?).
- Fit a double power-law with smooth transition.

$$J(R) = C \times R^{-\gamma} \left[ 1 + \left( \frac{R}{R_0} \right)^{\Delta \gamma / s} \right]^s$$



- Estimation of non-gaussian parameters errors (needed for testing hypothesis).
  - Profile likelihood.
  - Markov chain Monte Carlo (MCMC).

Characterisation of the proton flux - Analysis



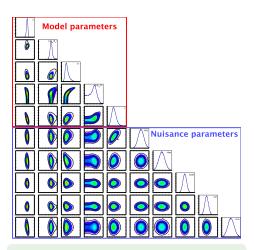
- Access PDFs (1D and 2D).
- Asymmetric errors.

- MCMC principle.
  - Based on the Bayes theorem.

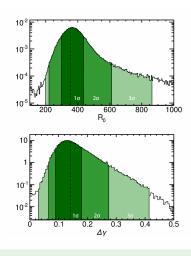
$$\underbrace{P(\vec{\theta}|data)}_{PDFs} \propto \underbrace{P(data|\vec{\theta})}_{Likelihood} \times \underbrace{P(\vec{\theta})}_{Prior}$$

- MCMC: Intelligent sampling of the likelihood and natural marginalisation.
- Systematic uncertainties ([SOS 2014, W. Verkeke]).
  - ► Goal: Propagate systematics from analysis into the fit.
  - Each source of systematics described by a model and some parameters (nuisance parameters NP) constrained by external measurement (calibration).

Caracterisation of the proton flux - Analysis

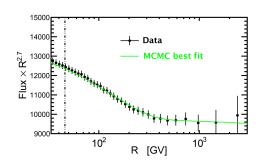


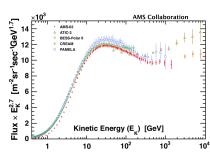
- $R_0 = 353^{+82}_{-53}$ .  $\Delta \gamma = 0.151^{+0.037}_{-0.048}$ .



"No break" hypothesis rejected at 3 sigma.

Characterisation of the proton flux - Results





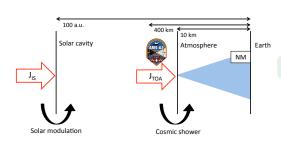
- MCMC approach: validation of the official fit (profile likelihood).
- ullet Break origin: source spectrum, transport...?  $\Rightarrow$  Other CR fluxes needed!

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  - The force field model.
  - What is a neutron monitor?
  - Reconstruction of solar modulation levels.
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What is solar modulation?

- Interaction between solar plasma and GCR particles (MHD).
- Flux variations correlated with solar activity (11 years cycle).
- Affect all charged CR data at low energy.
- Link between  $J_{IS}$  and  $J_{TOA}$ .

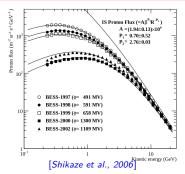


 $J_{IS}$  not directly measured.

The Force field model [Gleeson and Axford, 1967]

- Simple link between  $J_{IS}$  and  $J_{TOA}$ .
- One parameter  $\phi(t)$ , typical values between 200 MV and 1500 MV.

$$\begin{cases} E_{TOA} &= E_{IS} - Z\phi, \\ J_{TOA} \left( E_{TOA} \right) &= \frac{E_{TOA}^2 - m^2}{(E_{TOA} + Z\phi)^2 - m^2} \times J_{IS} \left( E_{TOA} + Z\phi \right). \end{cases}$$



- Reproduce well TOA data.
- Still widely used nowdays.  $\Rightarrow \phi$  from TOA fit.

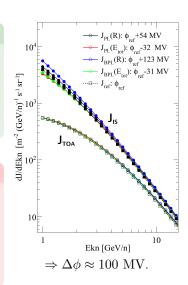
How do we reconstruct solar modulation levels? - TOA analysis

#### Methodology

- Assume a IS flux parametrisation.
- Choose a set of TOA data (over m time periods) → CRDB (lpsc.in2p3.fr/cosmic-rays-db).
- Fit **one** IS flux and m solar modulation parameters on the TOA data.

#### **Issues**

- $J_{IS}$  and solar modulation  $\phi$  highly degenerated.
- Solutions:
  - ⇒ Make simultaneous fit for different species and different time periods.
  - ⇒ Use other tracers of solar modulation.



What is a neutron monitor? [Simpson, Space Sci. Rev. 93 (2000) 11-32]

- Simple detectors.
  - Sensitive to neutrons from cosmic showers.
  - Continuous data taking (from 1960).
- Worldwide network.
  - Measurements at different R<sub>c</sub>.
- Independant measurement of  $\phi(t)$ .
- Very fine time resolution ( $\approx$  min).





How do we reconstruct solar modulation levels? - NM analysis

### Methodology

$$N(\vec{r},t) = \int_{R_c}^{\infty} \sum_{i=CRs} \mathcal{Y}_i(R,h) \frac{dJ_i^{\text{TOA}}}{dR} (R,\phi(t)) dR.$$

Link between  $J_{IS}$  and  $J_{TOA}$  similar to TOA analysis.

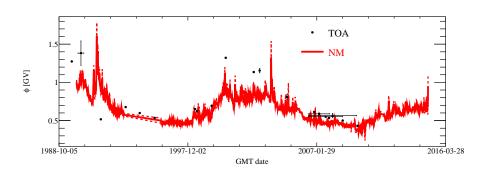
- Link between  $J_{IS}$  and  $J_{TOA}$ : Force field model.
- Link between  $J_{TOA}$  and NM count rates: **Yield function**  $\mathcal{Y}$ .
  - Modelisation of the earth atmosphere and the detector.

#### Issues

- Integrated measurement (energy and species).
- Large systematics[Maurin et al].
- Solution: Huge network of NM.

One  $\phi(t)$  for each stations.

How do we reconstruct solar modulation levels? - NM analysis



#### Ongoing work:

- ullet Compare  $\phi(t)$  for different NM stations, yield functions,  $J_{IS}$ .
- Provide reference phi values for the CR community.
- [Ghelfi et al]in preparation.

# Conclusion & Perspectives

#### Conclusion

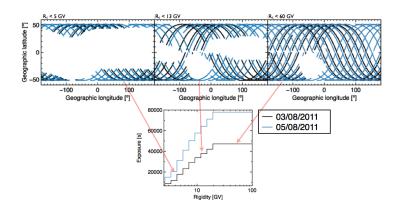
- AMS-02.
  - Involved in the Grenoble proton analysis (selected for proton flux publication).
  - Unfolding method selected as the official one.
- Solar modulation.
  - Analysis chain developped and tested for  $\phi(t)$  reconstruction.
  - Coherent  $\phi(t)$  over 50 years.

#### Perspectives

- Solar modulation.
  - lacksquare  $\phi(t)$  analysis with AMS-02 data (H and He analysis already done in the group).
- AMS-02.
  - ▶ Isotopic separation for the Lithium (Lithium analysis ongoing in the group).

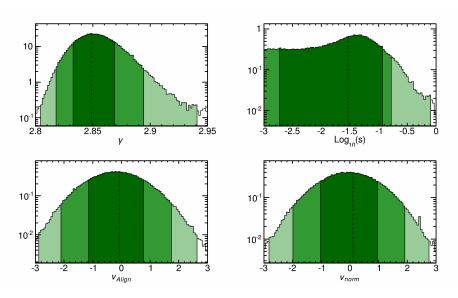
#### Back-up slides.

Exposure time.



# Back-up slides.

Fit parameters.



### Back-up slides.

Exposure time.

