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# **Probabilistic Modeling of the Space Radiation Environment**

Solar Energetic Particles (SEP), Solar Modulation and Space Radiation: New Opportunities in the AMS-02 ERA #2

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### Overview

 Why we need models for the space radiation environment

• Probabilistic Modeling Methodology

- Two new models:
  - -Episode-Integrated Fluence Model
  - –Peak Flux model



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# Why we need these models

- To determine the environment the mission will encounter
  - –Reduce costly-overdesign

• Give the mission the best chance to succeed -Protect instruments and humans from radiation





The Probabilistic Method The probability that no event with a flux  $\geq \phi$  in *T* years:

$$F_T(M) = \sum_n \frac{(\mu T)^n}{n!} \exp(-\mu T) \left[P(M)\right]^n$$

Where  $M = \log(\phi)$ 

This can be simplified to :

$$F_T(M) = exp\{-\mu T[1 - P(M)]\}$$





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## The Probabilistic Method

$$F_T(M) = exp\{-\mu T[1 - P(M)]\}$$

- No assumption has be made to elements or energy range.
- Need to find the cumulative distributions and episodes per year.



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## Two Models

- Both models:
  - Use a database where periods of elevated particle flux are identified by eye
  - Allow the user to chose mission start date and duration.
  - Confidence level that the user wishes to attain with their design.
  - Episode-Integrated Fluence Model (Robinson, 2015)
    - Missions ranging from a few weeks to several years
  - Peak Flux Model
    - Missions ranging from 10's of minutes to several years





# Data Base of SEP Episodes

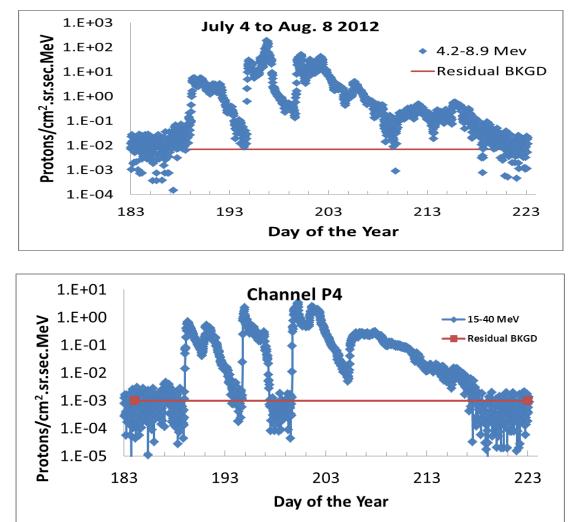
- Episode-Integrated
  Fluence Proton Data
  Base
  - GME on IMP-8 and EPS on GOES
  - Normalized using isotropic periods of flux and Rodriguez et al. [2014]
  - Redistributed the GOES fluence in GME channels

- Peak Flux Data Bases
  - Proton
    - o EPS on GOES
    - Normalized using periods of isotropic flux and Rodriguez et al. [2014]
  - Helium
    - Solar Energetic Particle
      Environment Modeling
      (SEPEM) system [Crosby et al., 2015]





## **Episode Identification**



Images from Robinson, 2015



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# **Cumulative Distributions**

- Each channel was graphed as 1 P(M)
- Used three equations to fit each distribution
  –Power law
  - -Log polynomial
  - –Frechet distribution (following work of Xapsos et al. 1998)

$$N = N_{tot} (\frac{\phi^{-b} - \phi_{max}^{-b}}{\phi_{min}^{-b} - \phi_{max}^{-b}})$$

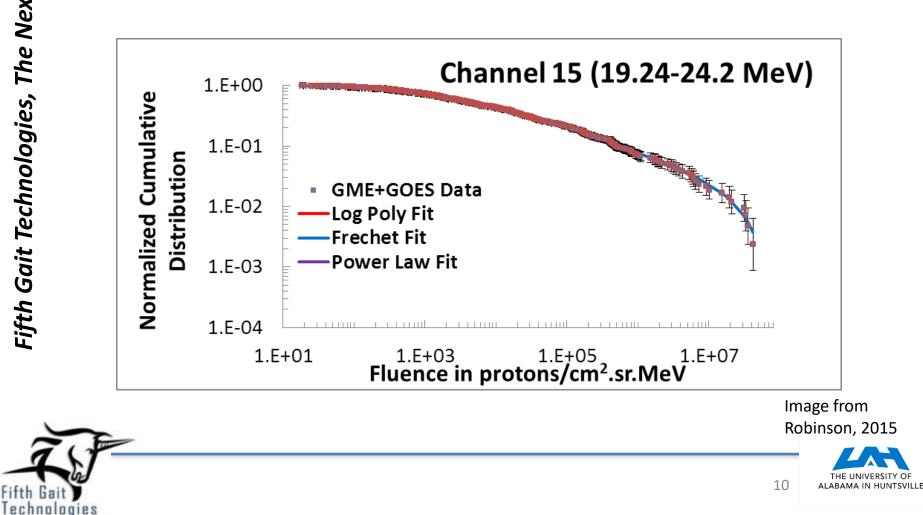


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### **Cumulative Distributions**



Three different methods were used:

- Actual number of episodes per year (1974-2013)
- Sunspot Proxy (1953-1974, 2013-2019)
- 11-year solar cycle fit (2019 2052)





Sunspot Proxy

- Hathaway et al. (1994) predicted sunspot numbers
- Sunspot numbers compared to episodes per year
  - -Exponential distribution with dead time correction factor (Robinson 2015)

$$N = (a n + b) \exp[-q(a n + b)]$$





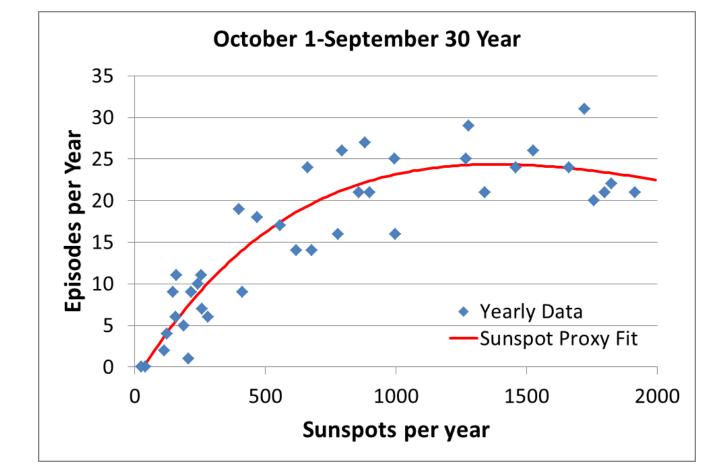
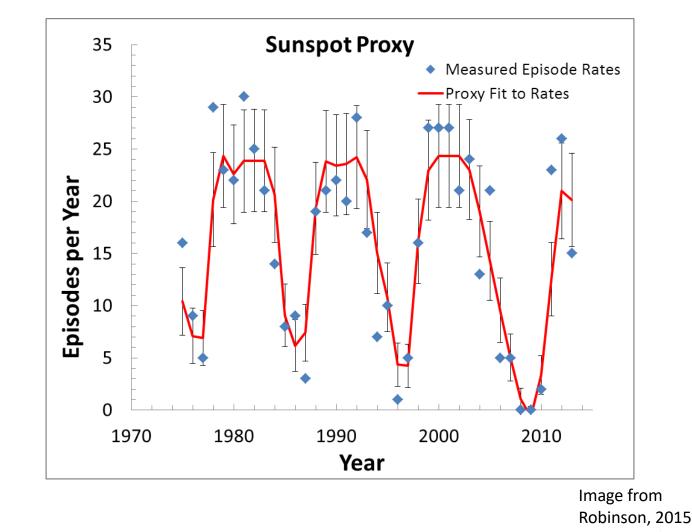


Image from Robinson, 2015



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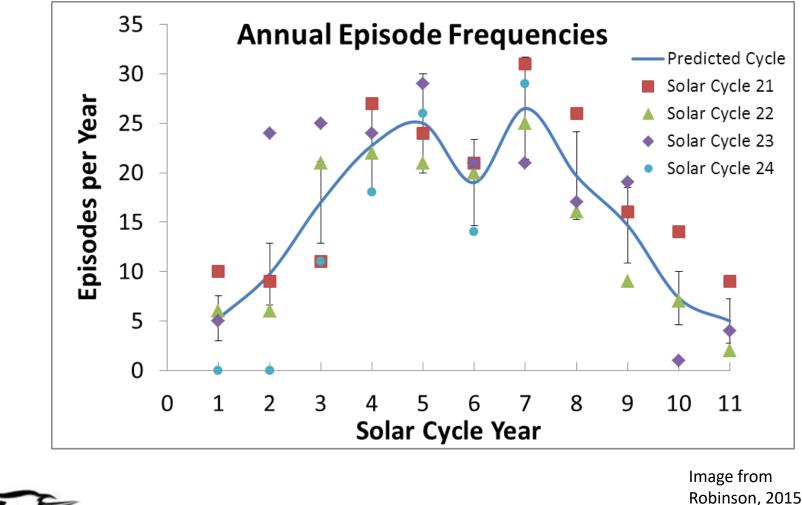
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11-year solar cycle fit

- Fit an 11-year cycle to the database
- The set with the best Reduced Chi Squared was the year starting October 1 ending September 30 (Robinson 2015)



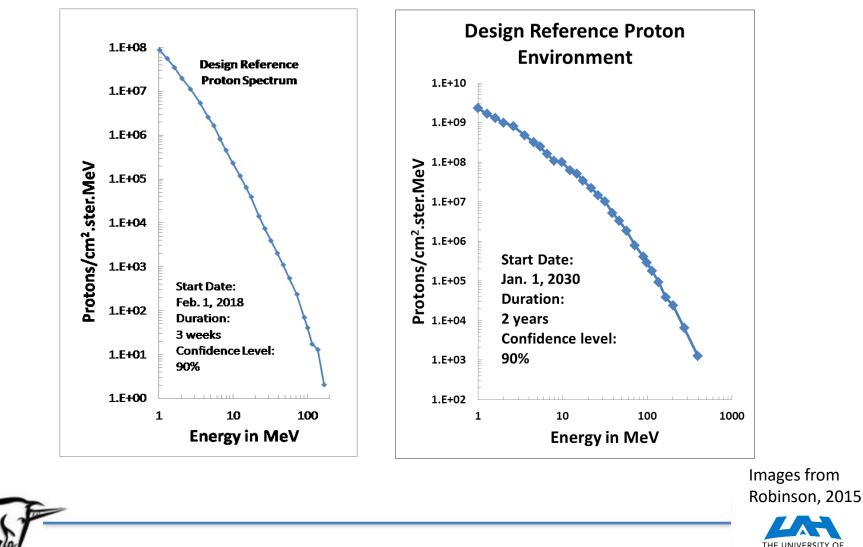






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### **Episode-Integrated Fluence Model**



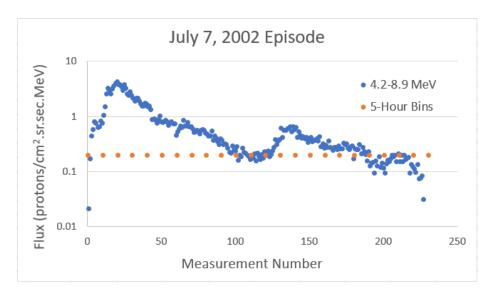
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## Peak Flux Model

Short Mission:

- Chronological list of flux measurements
  - Remove measurement at BKGD
- Mission length used to group data
  - Maximum flux taken to build a custom cumulative distribution
- Confidence Level used to determine if flux is above BKGD



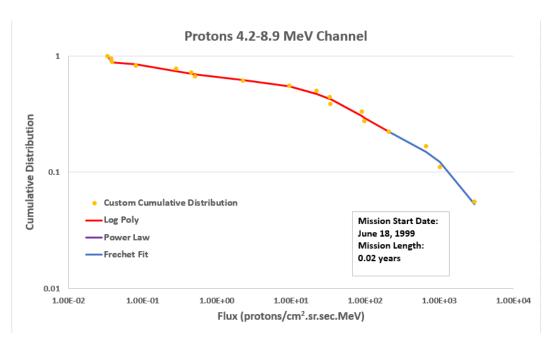




## Peak Flux Model

Short Mission:

- If under 1000 groups, use
  - 3 fits [Robinson, 2015]:
  - Power Law
  - 6<sup>th</sup> Order Logarithmic
    Polynomial
  - Fréchet Distribution
- If over 1000 groups, use the custom distribution
- Linear interpolation used between values in distribution



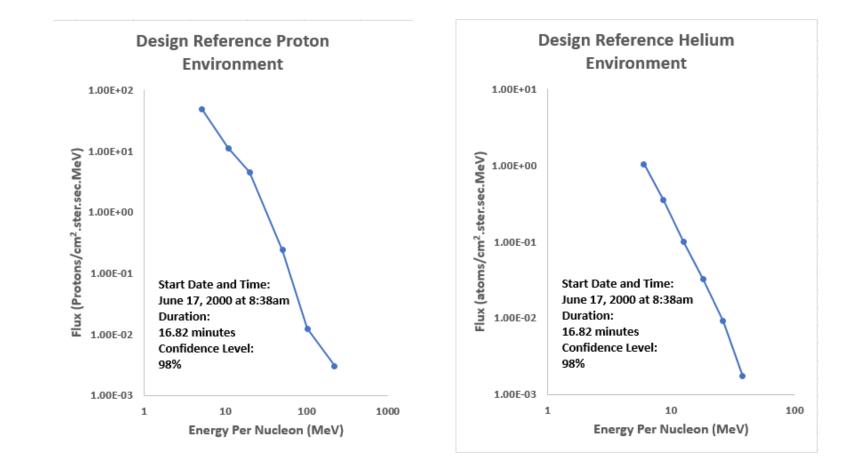


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#### Peak Flux Model





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### **Future Work**

- Update the Episode-Integrated Fluence Model
  - -Include data from 2014-2016
  - –Improve the normalization between the satellites

- Add the heavier ions to the Peak Flux Model
  - -Build data bases for the most abundant elements
  - -Use elemental ratios to scale distributions





### References

- Robinson, Z. D. (2015). New probabilistic model for episode integrated fluences of protons using episodes from 1973-2013. University of Alabama in Huntsville.
- Xapsos, M. A., Summers, G. P., & Burke, E. A. (1998). Probability model for peak fluxes of solar proton events. *IEEE Transactions on Nuclear Science*, 45(6 PART 1), 2948–2953. <u>https://doi.org/10.1109/23.736551</u>
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- Kotz, S., & Nadarajah, S. (2000). *Extreme Value Distribution Theory and Applications*. Imperial College Press.
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- Provides a way to study the extremes of a distribution in order to provide better predictions of the tails of a statistical distribution.
  - Used in a wide range of fields (including radioactive emission and rainfall analysis)
    - Determining whether outlying observations should be used by astronomers. (Kotz and Nadarajah, 2000)
  - This method used in the two models discussed today follows the work of Xapsos et al. (1998).





Maximize entropy

$$S = -\int_0^{M_{max}} p(M) \ln[p(M)] \, dM$$

Technologies

Where 
$$M = \log(\phi)$$

Conditions:

$$\int_0^{M_{max}} p(M) dM = 1$$

$$\int_0^{M_{max}} Mp(M) dM = \omega$$

$$M_{min}=0$$

$$M_{max}$$
 is finite



Using Lagrange multipliers

$$p(M) = \frac{\lambda}{1 - \exp(-\lambda M_{\max})} \exp(-\lambda M)$$

• Integrate from 0 to *M*:

$$P(M) = \frac{1 - \exp(-\lambda M)}{1 - \exp(-\lambda M_{\max})}$$



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• The probability that n events won't have a flux  $\geq \phi$ :

 $[P(M)]^n$ 

• Using Poisson's equation:

$$\frac{\left[e^{(-\mu T)}(\mu T)^n\right]}{n!}$$



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### **Cumulative Distributions**

