

# eXtreme Space Weather Events: Probabilities and Uncertainties

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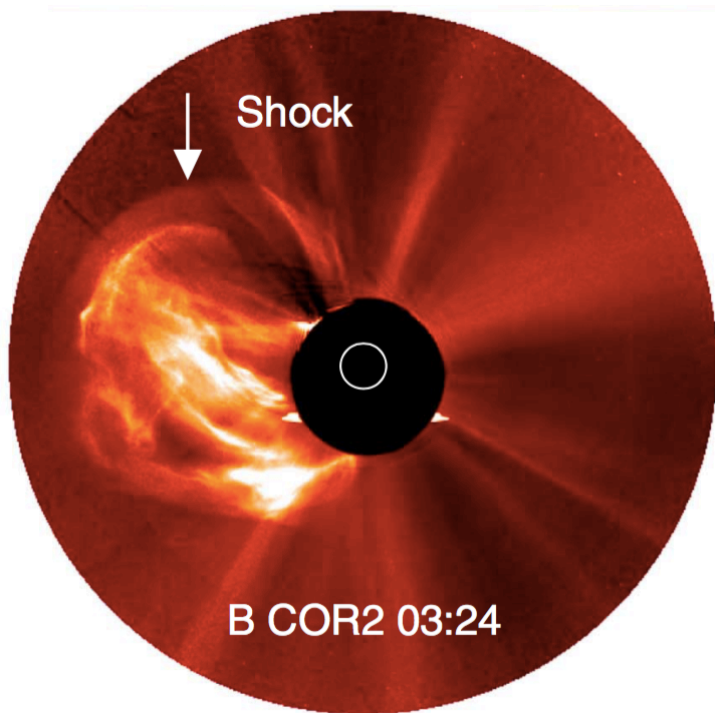
Research supported by NASA's LWS Program and NSF's FESD Program

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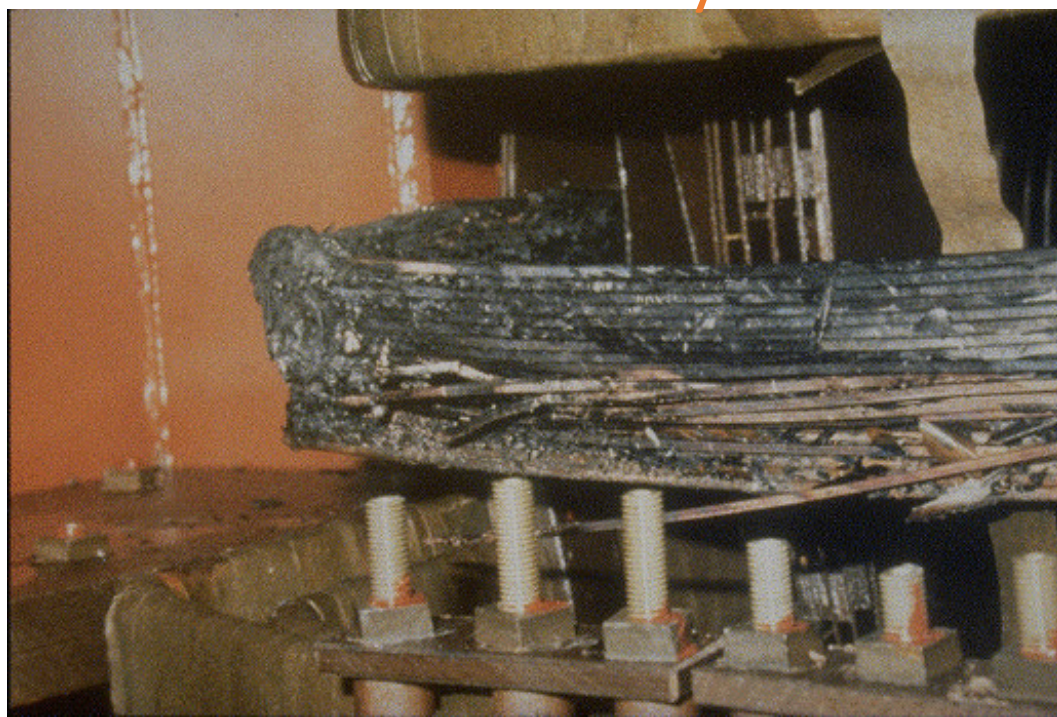
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# Why do we care about predicting **eXtreme** space weather events?

## Science



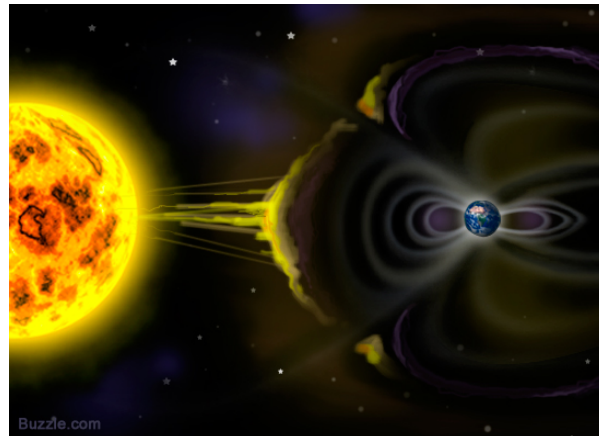
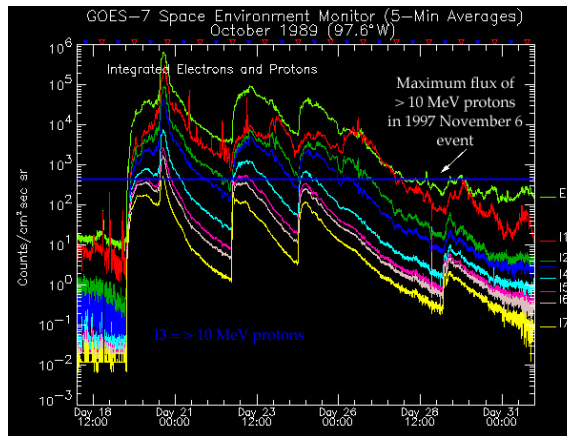
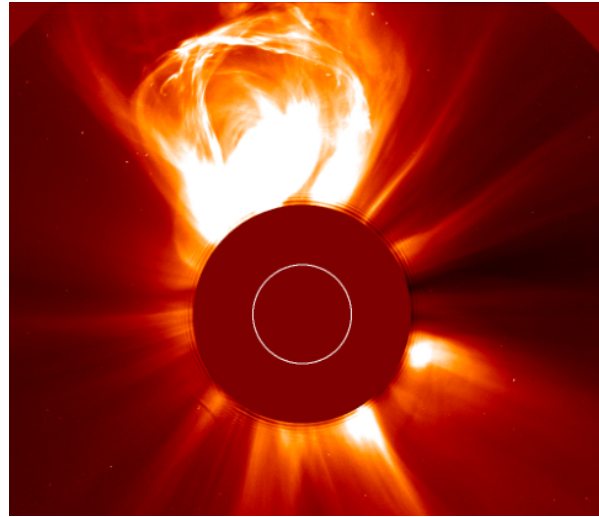
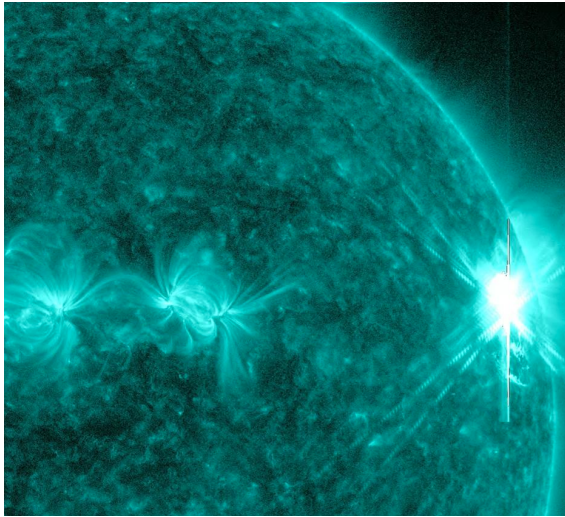
## Society



## Motivation for these Studies

How likely is it that I'm going to witness a Carrington-like event - or worse - during my lifetime?

# What IS an eXtreme space weather event?



A simple approach for estimating the likelihood of another Carrington Event: Time to Event

$$P(x) = \frac{1}{1 + \tau}$$

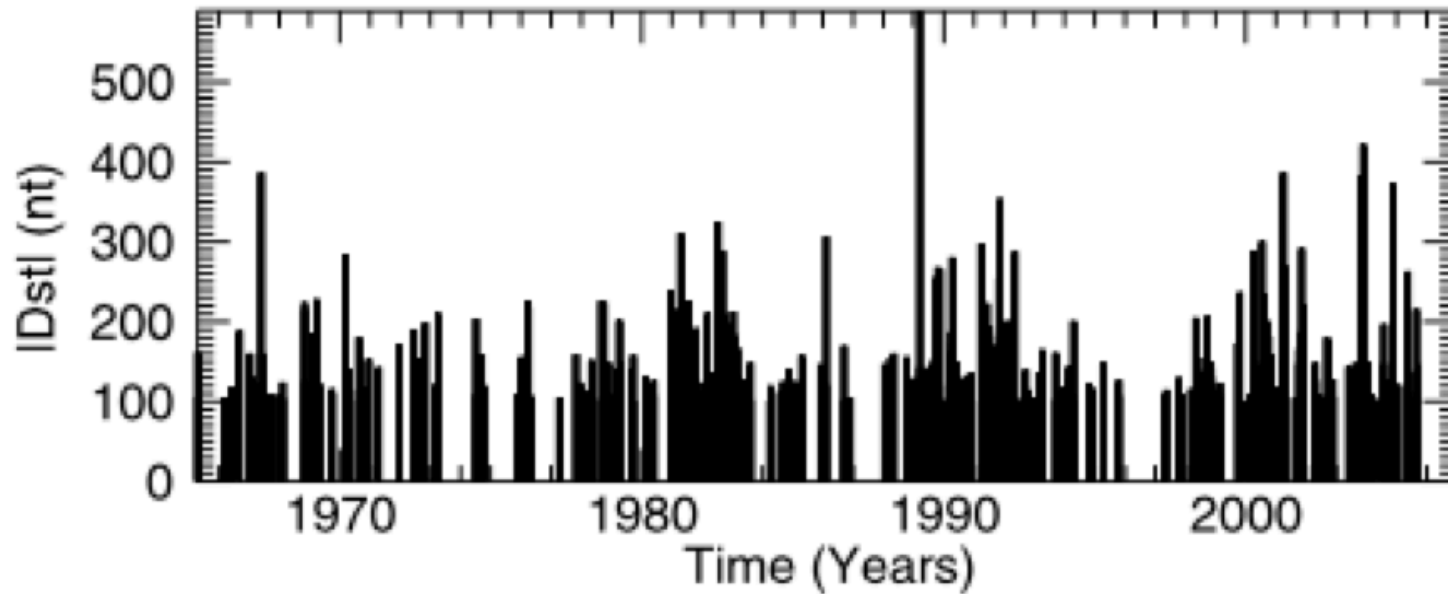
## A simple approach for estimating the likelihood of another Carrington Event: Time to Event

$$P(x) = \frac{1}{1 + \tau}$$

- If  $\tau = 100$  years
  - $P \cong 9\%$  per decade
- If  $\tau = 153$  years
  - $P \cong 6\%$  per decade



# Estimating the likelihood of another Carrington Event using the assumption of a power-law distribution



*Riley (2012)*

# Estimating the likelihood of another Carrington Event using the assumption of quasi-power-law distribution

- Assumptions:

- Power-law distribution

- No cut-off

- Time stationarity

- No clustering

- No secular trends

$$p(x) = Cx^{-\alpha}$$

$$P(x \geq x_{crit}) = \int_{x_{crit}}^{\infty} p(x') dx'$$

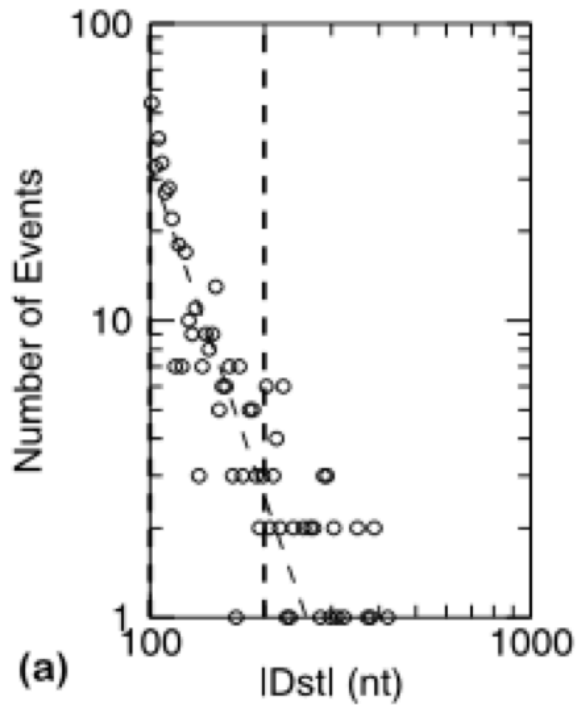
$$P(x \geq x_{crit}) = \frac{C}{\alpha - 1} x_{crit}^{-\alpha+1}$$

$$\alpha - 1 = N \left[ \sum_{i=1}^N \ln \frac{x_i}{x_{min}} \right]^{-1}$$

$$P(x \geq x_{crit}, t = \Delta t) = 1 - e^{-N \frac{\Delta t}{\tau} P(x \geq x_{crit})}$$

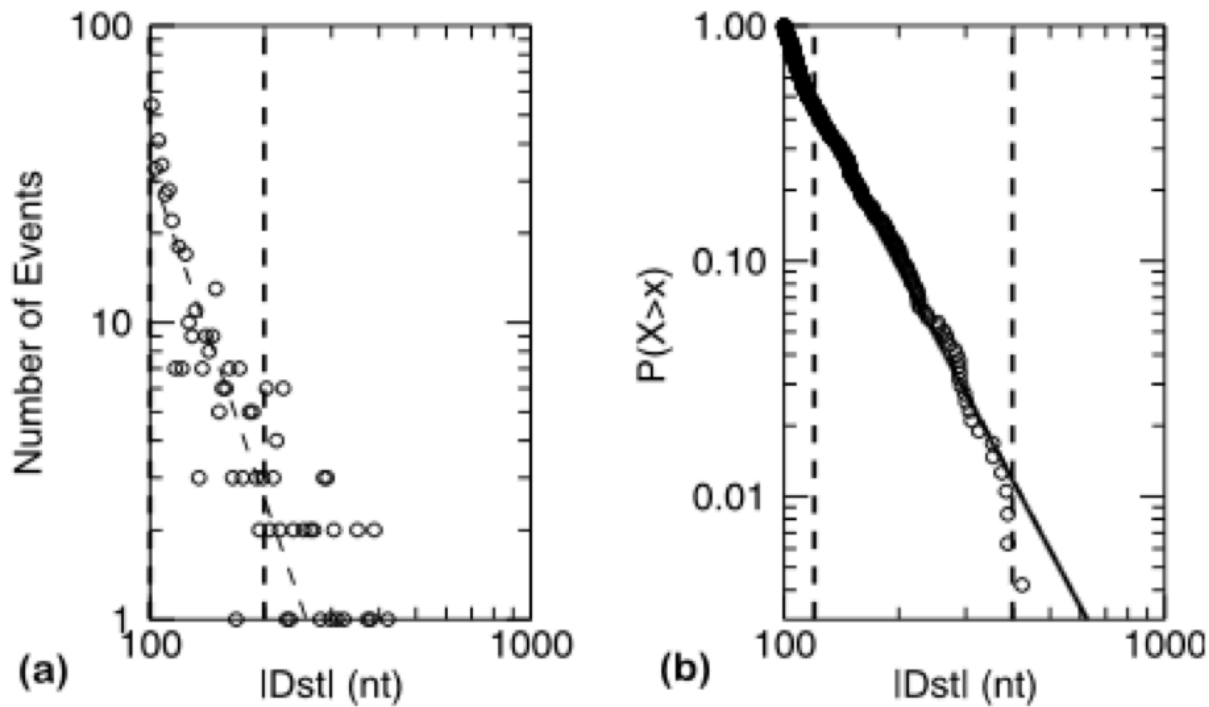
Riley (2012)

# Estimating the likelihood of another Carrington Event using the assumption of quasi-power-law distribution



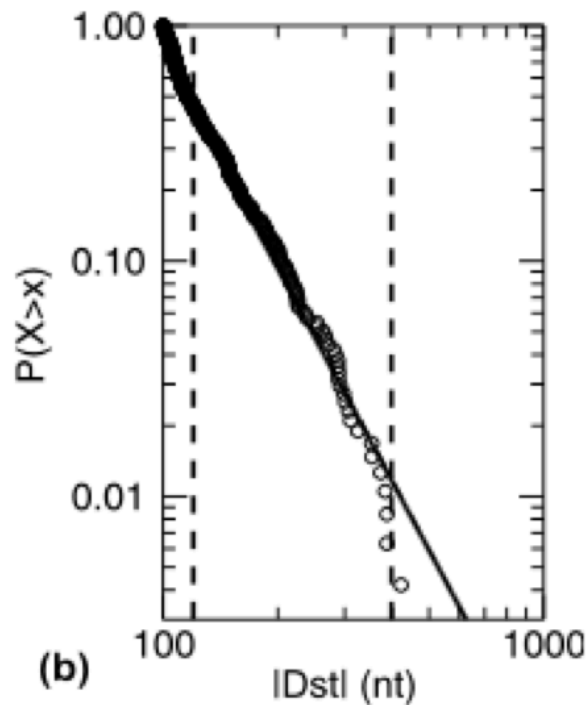
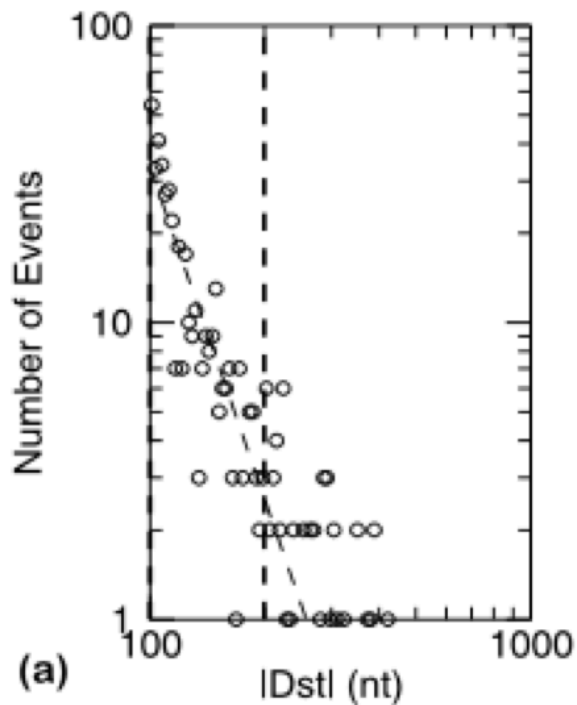
Riley (2012)

# Estimating the likelihood of another Carrington Event using the assumption of quasi-power-law distribution



Riley (2012)

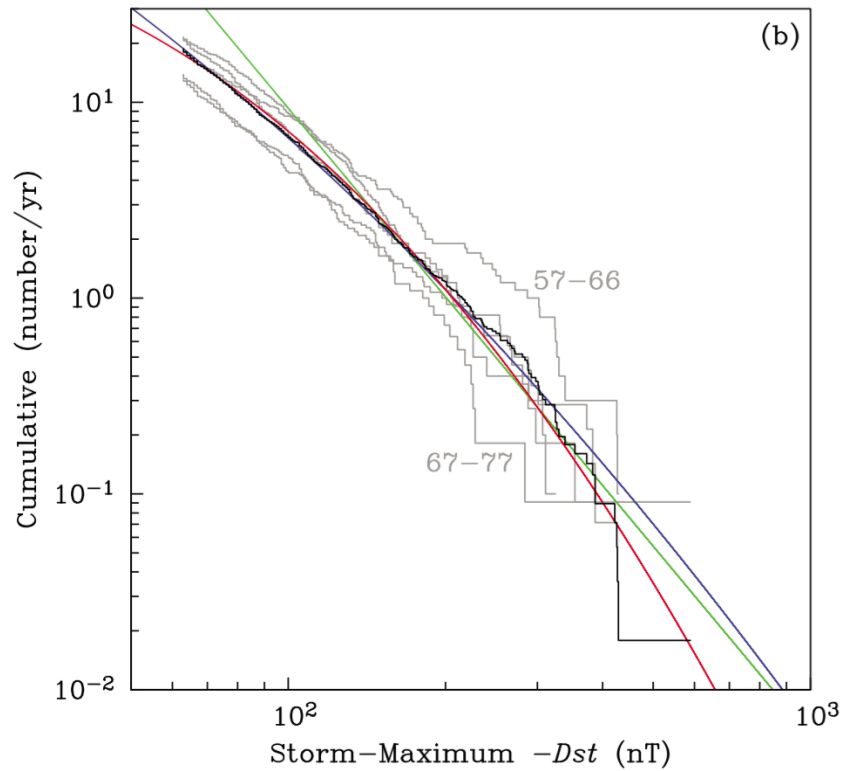
# Estimating the likelihood of another Carrington Event using the assumption of quasi-power-law distribution



- For  $Dst < -850$  nT:
  - 12% probability of occurrence over the next decade
- For  $Dst < -1700$  nT:
  - 1.5% probability of occurrence over the next decade

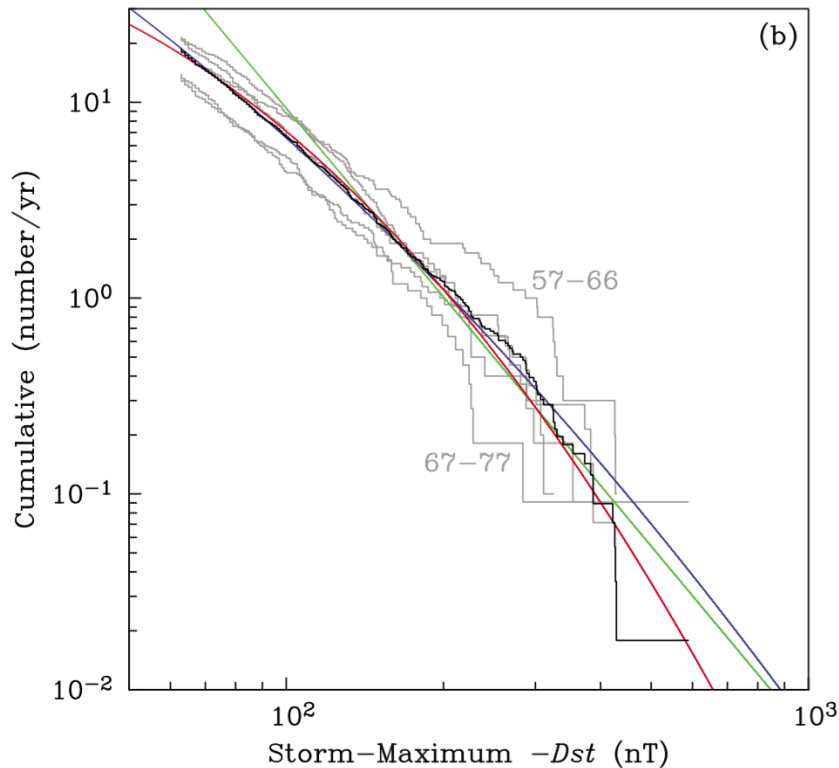
Riley (2012)

Do the data really follow a power-law?



*Love, Rigler, Pulkkinen, and Riley (2015)*

# Do the data really follow a power-law?



- Lognormal Occurrence rate for Carrington event:
  - 1.13 events per century
  - 95% CI [0.42, 2.41]
- Power-law Occurrence Rate:
  - 1.2 events per century
- The log-normal estimate is equivalent to a
  - 10.1% chance of occurrence over next decade
  - 95% CI [4.0, 19.4]
- The power-law estimate equates to a
  - 11% chance of occurrence over next decade

*Love, Rigler, Pulkkinen, and Riley (2015)*

# A General approach for estimating probabilities and uncertainties

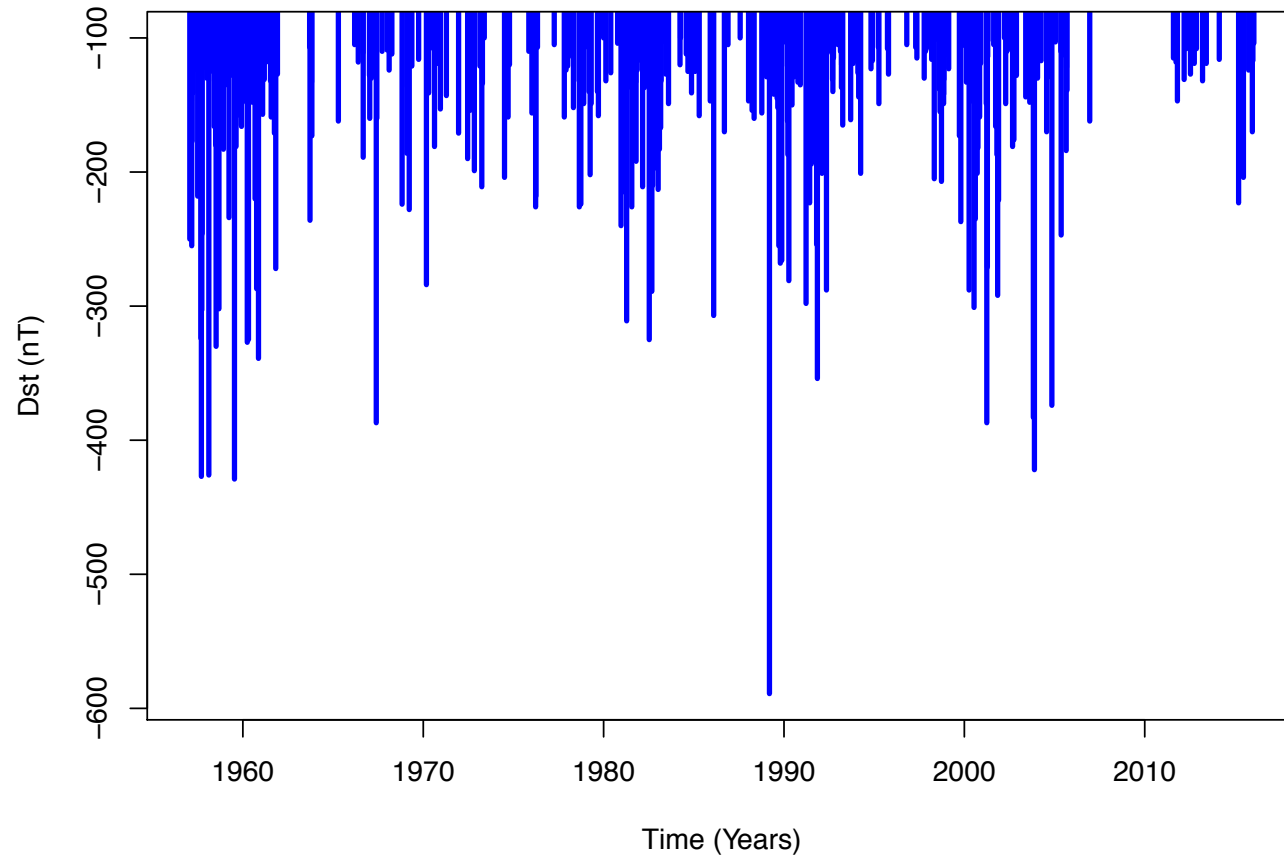
- Allow a variety of distributions
  1. Power-law
  2. Log-normal
  3. Exponential
- Provide robust procedures for estimating statistical model parameters
  1. KS Statistics – to estimate  $x_{\min}$  and  $\alpha$
  2. Non-parametric bootstrapping – to estimate p-value for Power-law distribution and confidence intervals on forecast
  3. Kuong's test for model comparison – to reject one model over another

*Riley (2016)*



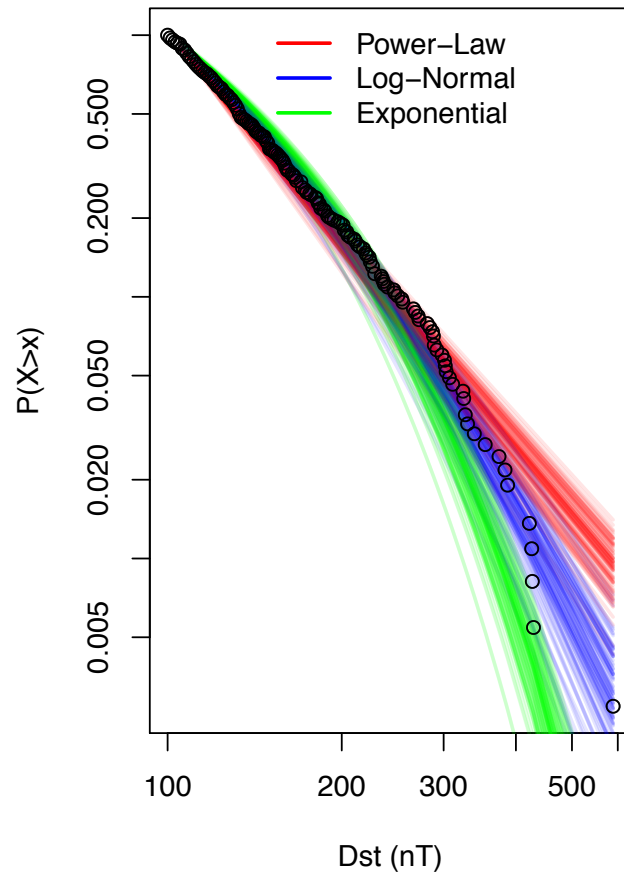
# The Disturbance Storm Time Index (*Dst*)

Storms where  $Dst < -100$  nT

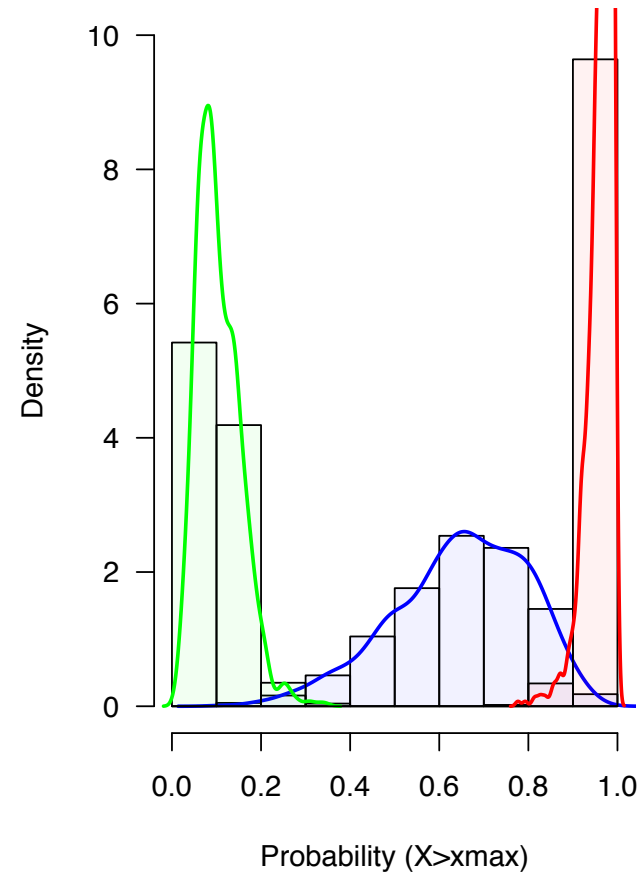


# The Disturbance Storm Time Index (Dst)

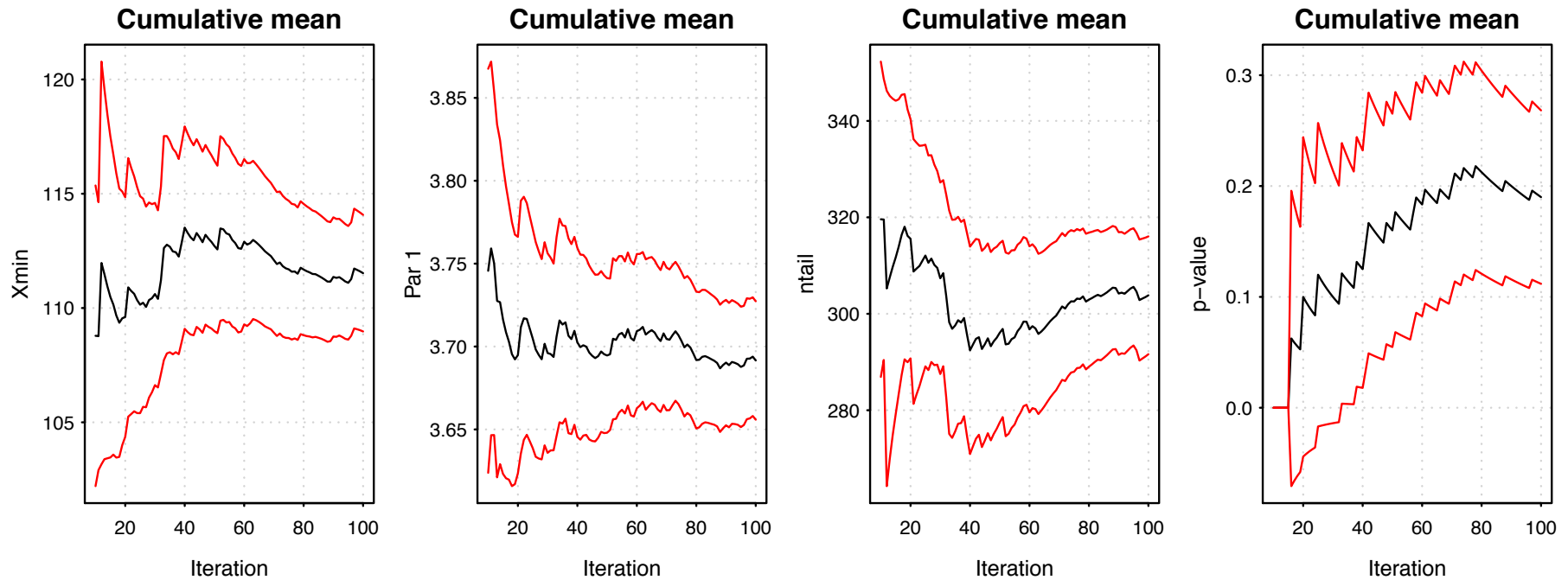
Storms where Dst < -100 nT



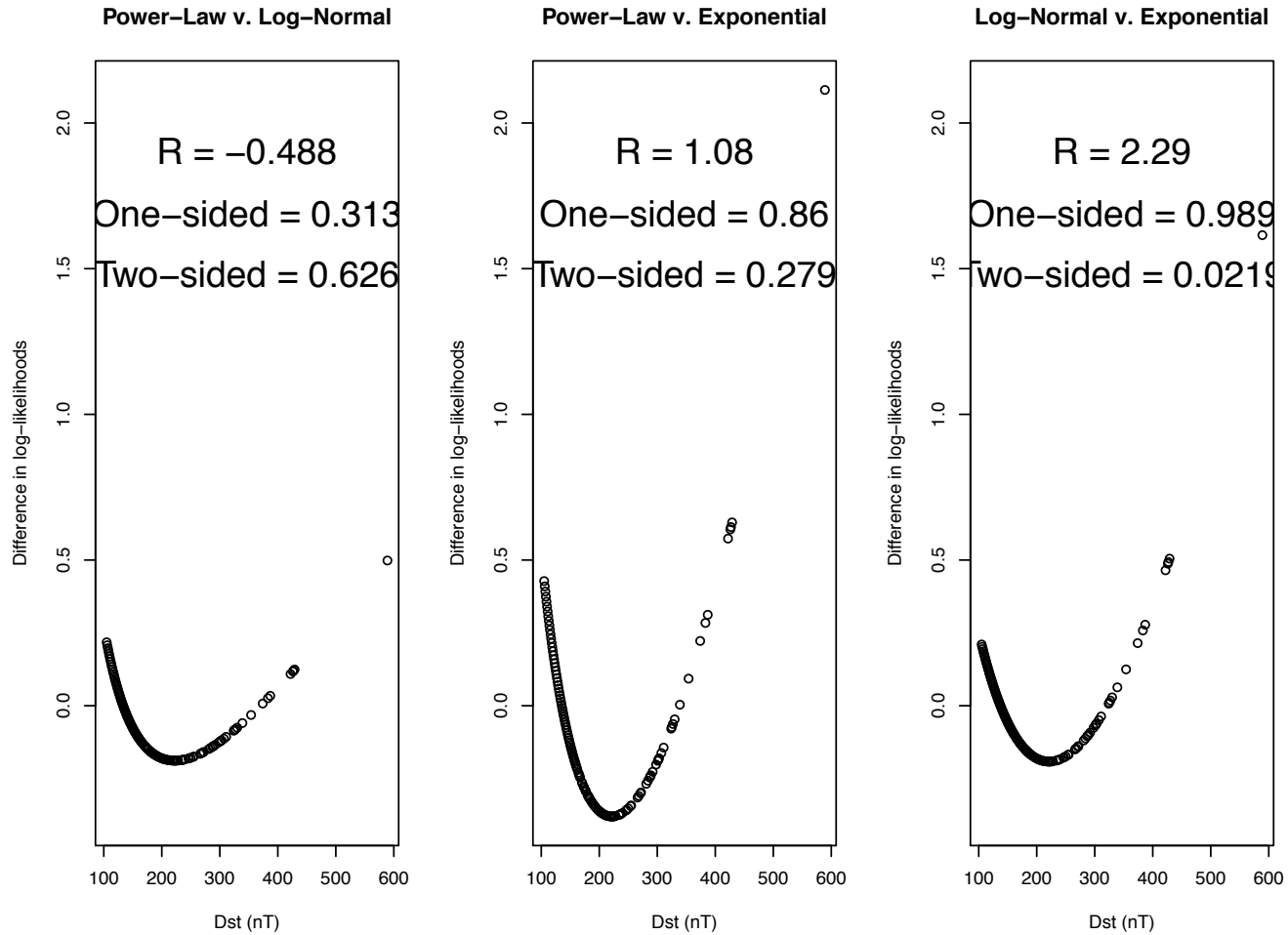
Bootstrap Distributions



# *Dst* Bootstrap Parameters for Power-Law Distribution



# Kuong's test for different distributions of $Dst$



Best Estimates and confidence intervals for the probability of an extreme event ( $Dst < -850$  nT) over the next decade:

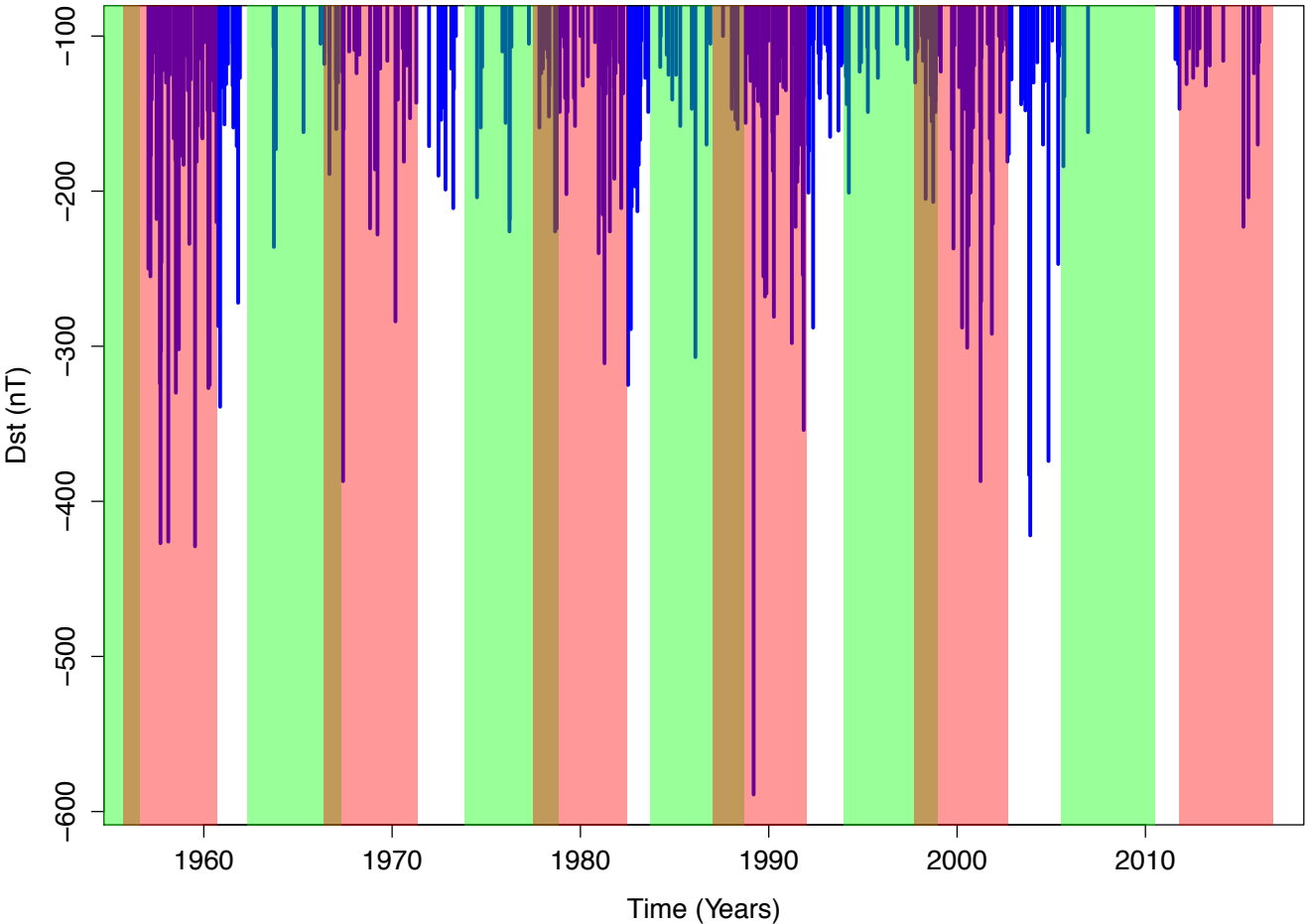
Distribution	Median (%)	2.5% (%)	97.5% (%)
Exponential	0.02	0.004	0.08
Log-Normal	3.0	0.6	9.0
Power-Law ('64-'16)*	10.3	0.9	18.7
Power-Law ('57-'16)**	20.3	12.5	30.1

\*NASA's OMNI

\*Kyoto / NOAA

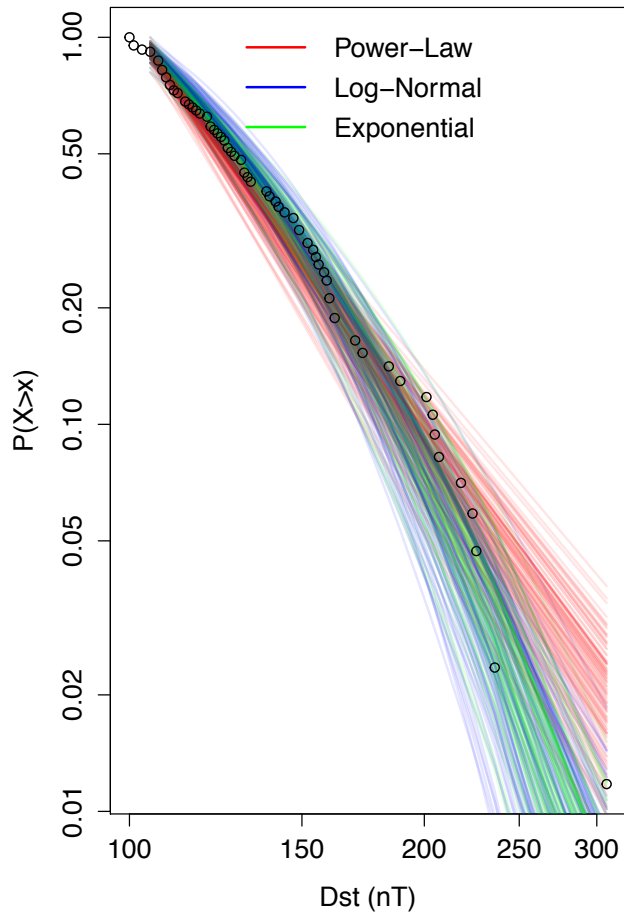
# Estimating probabilities for solar **min** and Solar **Max** Conditions

Storms where Dst < -100 nT

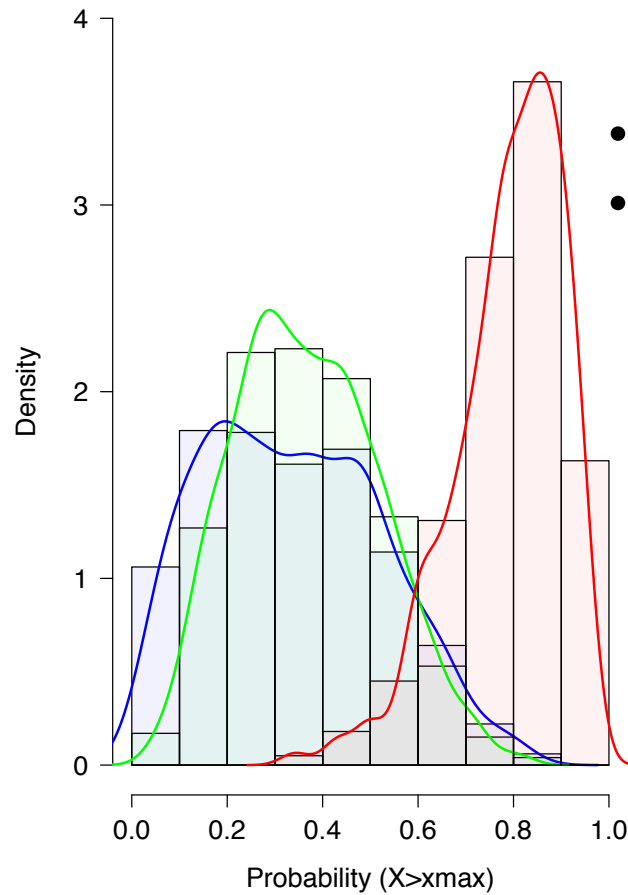


# Dst Distributions and probabilities for Solar Minimum

Storms where Dst < -100 nT



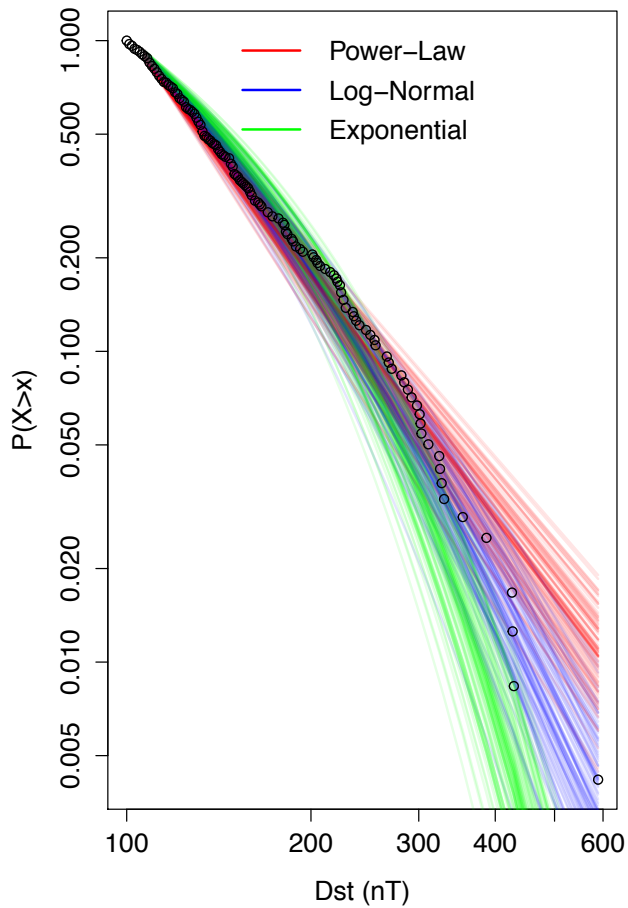
Bootstrap Distributions



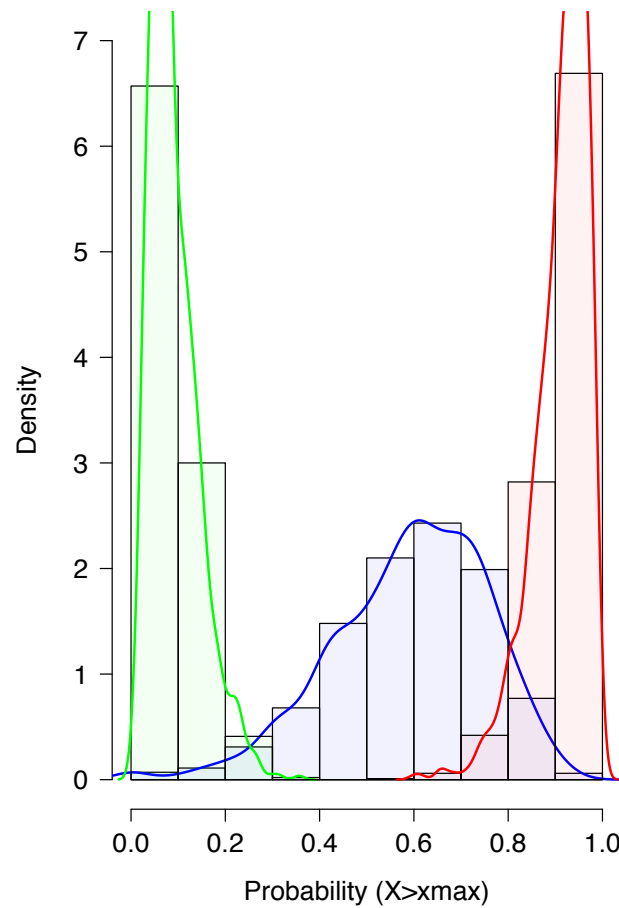
- Dst < -850 nT
- Solar Minimum Conditions
  - 1.4% probability of occurrence over “next decade”

# Dst Distributions and probabilities for Solar Maximum

Storms where Dst < -100 nT



Bootstrap Distributions



- Dst < -850 nT
- Solar Max. Conditions
  - 28% probability of occurrence over “next decade”



## Summary

The probability of another Carrington event depends on your definition of a “Carrington event” (Beauty is in the eye of the beholder)

# Summary

- Estimates for a Carrington event range from 2.5% (SPEs, Dst with Log-Normal distribution) to 10.3% (Dst, Power-Law Distribution)
- Between solar minimum and solar maximum conditions, the probability varies from 1.5% to 28%.

# Summary

The uncertainties in these estimates are substantial:

- For  $Dst < -850$  nt, assuming a power-law distribution:
  - Prob./decade: 10.3%, 95%CI [0.9,18.7]

# Summary

When communicating estimates, it is crucial to also communicate:

- Uncertainties associated with them, and
- Assumptions used to derive them

## Summary

Applying the same techniques to other “catastrophe” scenarios would help policy makers to prioritize limited resources.