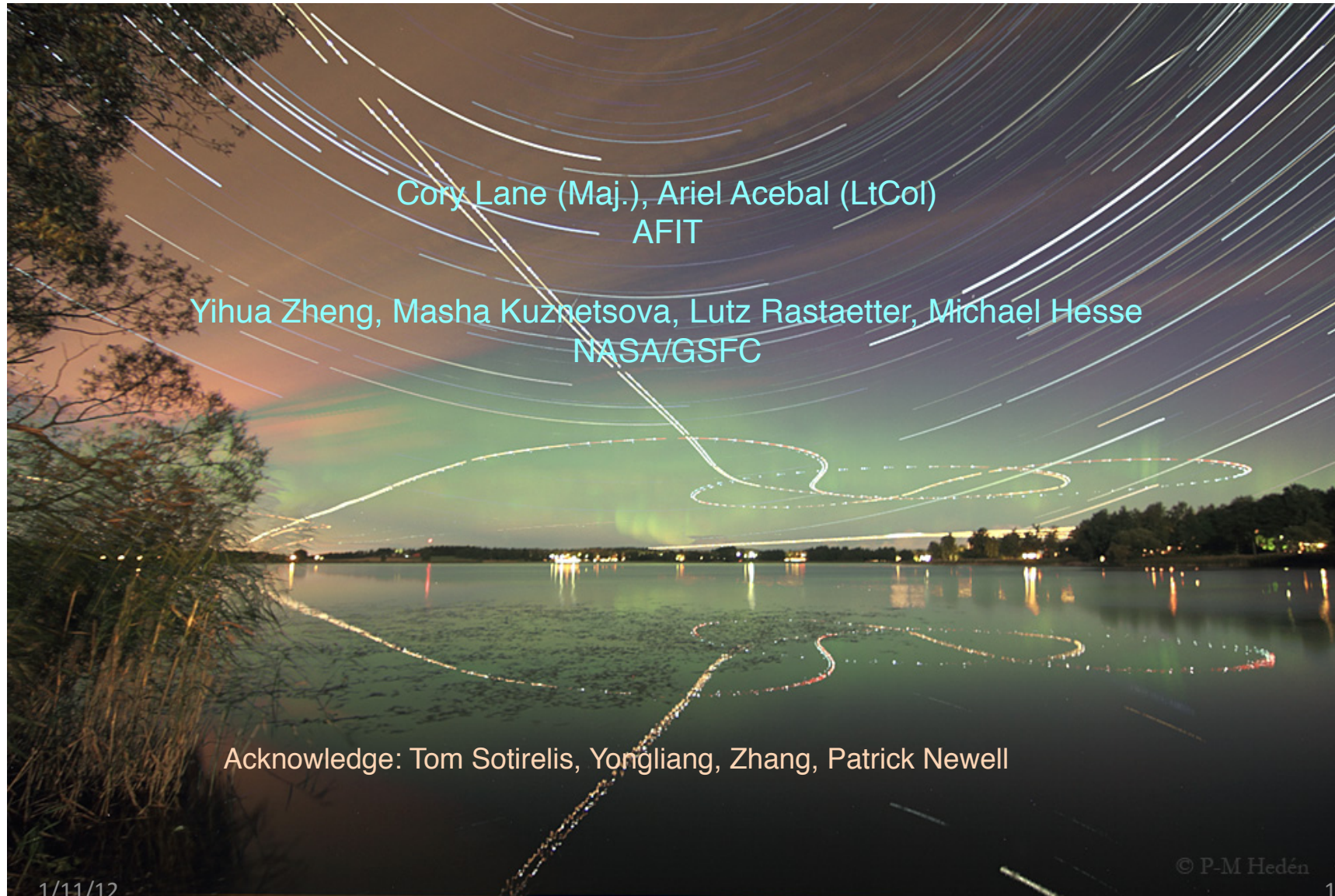




Auroral Model V&V Efforts



Cory Lane (Maj.), Ariel Acebal (LtCol)
AFIT

Yihua Zheng, Masha Kuznetsova, Lutz Rastaetter, Michael Hesse
NASA/GSFC

Acknowledge: Tom Sotirelis, Yongliang, Zhang, Patrick Newell



Overview



- Motivation
- What has been done (Cory)
- Future plan



Motivation



- Auroral precipitation models have been valuable both in terms of space weather applications and space science research.
- Aurora, as manifestation of SW-Magnetosphere coupling, can be used as a remote sensing tool for magnetospheric processes.
 - ionospheric conductance
 - Field-aligned currents (FACs)
 - Poynting flux – ion outflow
 - Joule Heating
- Yet very limited testing has been performed regarding model performance.
- A variety of auroral models are available, including **empirical models that are parameterized by geomagnetic indices or upstream solar wind conditions**, **nowcasting models that are based on satellite observations**, or **those derived from physics-based, coupled global models**.



Challenges



- What physical quantity/quantities to choose
- How to define the physical quantify/quantities from model and data
- Which data sets to use



Validation already been done



Newell, P. T., T. Sotirelis, K. Liou, A. R. Lee, S. Wing, J. Green, and R. Redmon (2010), Predictive ability of four auroral precipitation models as evaluated using Polar UVI global images, Space Weather, 8, S12004, doi:10.1029/2010SW000604



better

Instantaneous

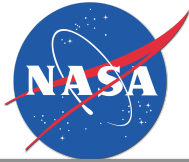
1. Brautigam IMF model ($r=0.68$)
2. Evans nowcast model ($r=0.70$)
3. Hardy Kp model ($r=0.72$)
4. Ovation Prime ($r=0.75$)

Hourly averages

1. Brautigam IMF model ($r=0.69$)
2. Hardy Kp model ($r=0.74$)
3. Ovation Prime ($r=0.76$)
4. Evans nowcast model ($r=0.77$)

Physical parameter: Precipitating power

Using Polar/UVI
during 1996 -1997



Validation Methodology



Physical quantities: **Equatorward boundary**

Poleward boundary

Define the boundary: not trivial

Method 1: a threshold in flux (50 eV - 20 keV) as in Hardy model

Method 2: Newell et al. approach, where different identified regions have physical meanings

Method 3: Redmond et al approach, constant value in flux (sub energy range of DMSP: 1.39 keV -30 keV) as a threshold

http://ccmc.gsfc.nasa.gov/RoR_WWW/presentations/boundary_options.pdf

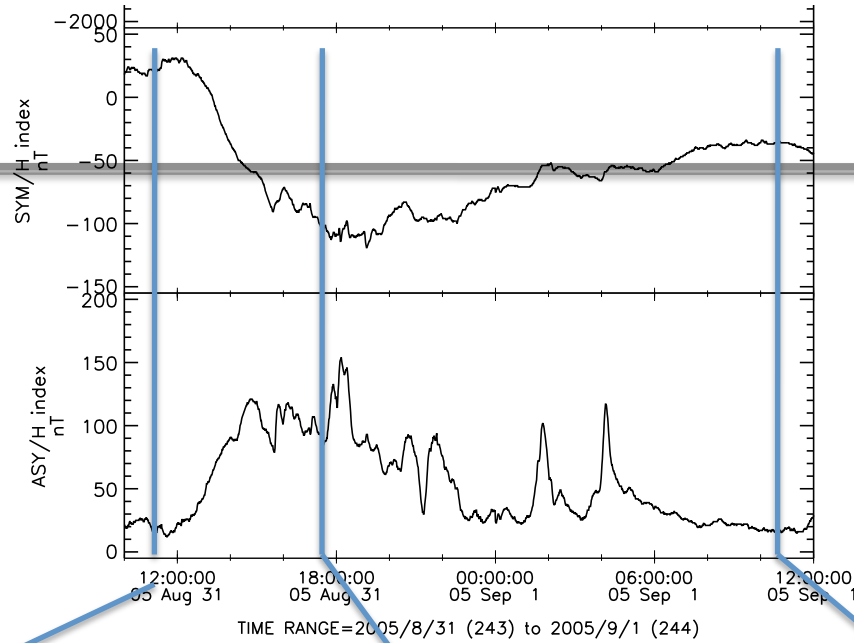


Measure of Performance



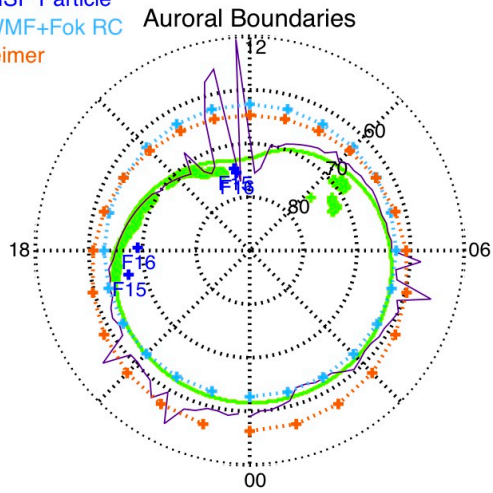
- PE for a fixed local time (PE)
 - How well model performs in terms of temporal revolution
- Divided into different local time sectors – such as the dusk side
- Whether the deviation in all local time is uniform or not – a measure of whether the model captures the MLT feature
 - How well models do

correlation in MLT binned by activity level or for a specific time - auroral imaging



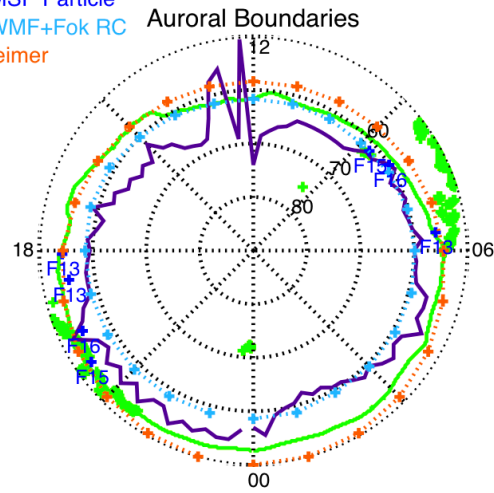
Time: 20050831_1025UT

DMSP SSUSI
Ovation Prime
DMSP Particle
SWMF+Fok RC
Weimer



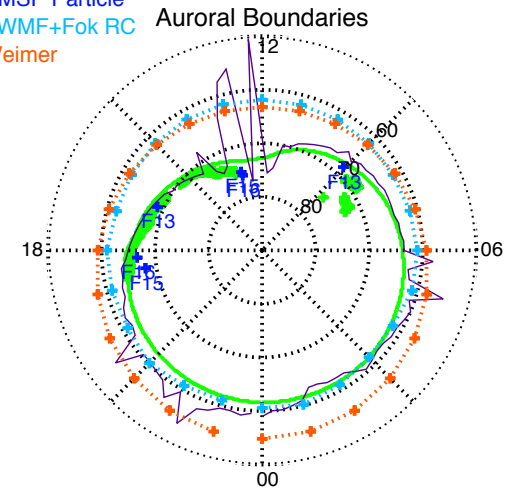
Time: 20050831_1726UT

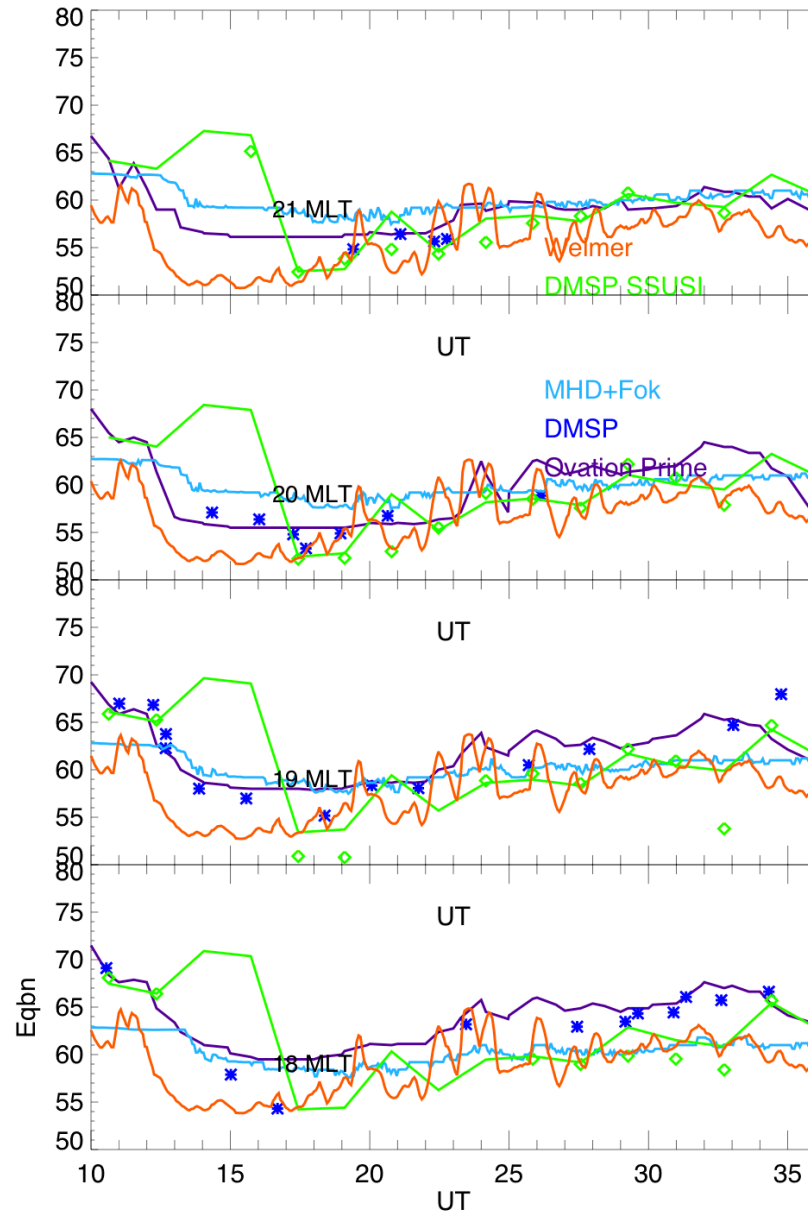
DMSP SSUSI
Ovation Prime
DMSP Particle
SWMF+Fok RC
Weimer



Time: 20050901_1025UT

DMSP SSUSI
Ovation Prime
DMSP Particle
SWMF+Fok RC
Weimer







Research Objective



- Develop and execute a meaningful comparison between DMSP energy flux measurements (in situ) and the calculated spatial and temporal energy outputs of various computational auroral models to include Ovation Prime, (Old & New) Hardy, SWMF/Fok-RC, and AMIE.
- Investigate the effect of geomagnetic activity and seasons on these results.
- From these comparisons, assign quantitative performance scores, utilizing various statistical measures (e.g., PE, Skill Score).



Validation Results



- A: 0.4 ergs/cm²/s
- B: 0.6 ergs/cm²/s
- C: 1.0 ergs/cm²/s

A constant energy flux threshold is used for obtaining the equatorward boundary

1 erg = 10^{-7} joule

1 eV = 1.6×10^{-19} joule

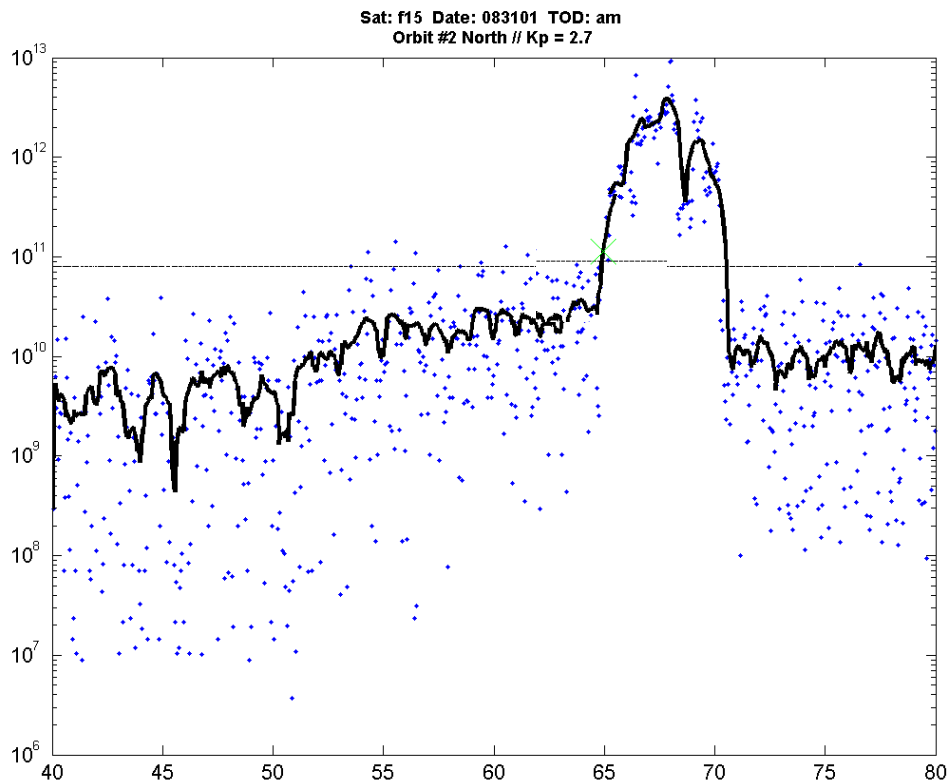
Threshold 0.4 ergs/cm²/s = 2.5×10^{11} eV/cm²/s

DMSP unit: eV/cm²/s/sr

Limit = 8.0×10^{10} eV/cm²/s/sr



DMSP



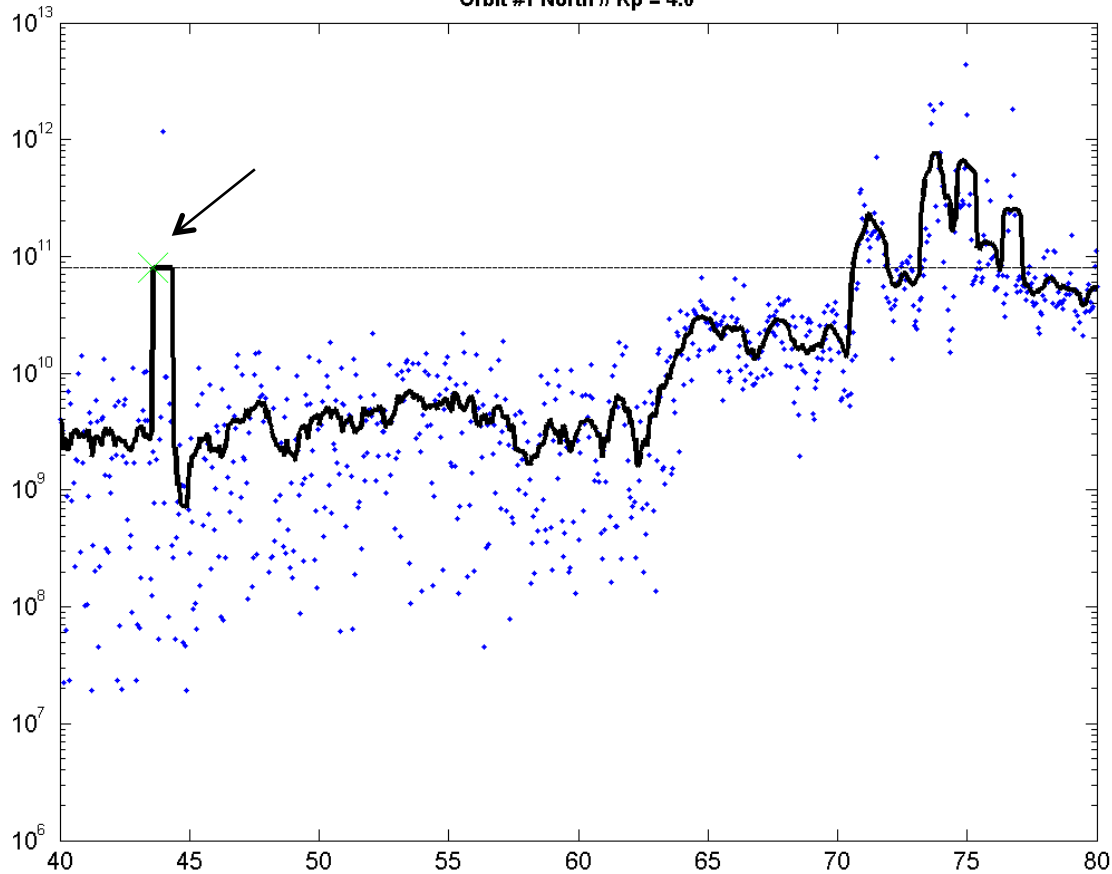
- DMSP satellite “pass”
- Northern Hemisphere
- Threshold is set to $\sim 8.0 \times 10^{10}$, $\sim 1.2 \times 10^{11}$, and $\sim 2.0 \times 10^{11}$ eV/cm²/sec/sr
- 15-sec moving average is used (black line) for smoothing (all 0's removed)
- Green X represents crossing point
- More than 5800 of these passes have been collected...



DMSP



Sat: f13 Date: 051505 TOD: pm
Orbit #1 North // Kp = 4.0



...and individually
validated "by hand."

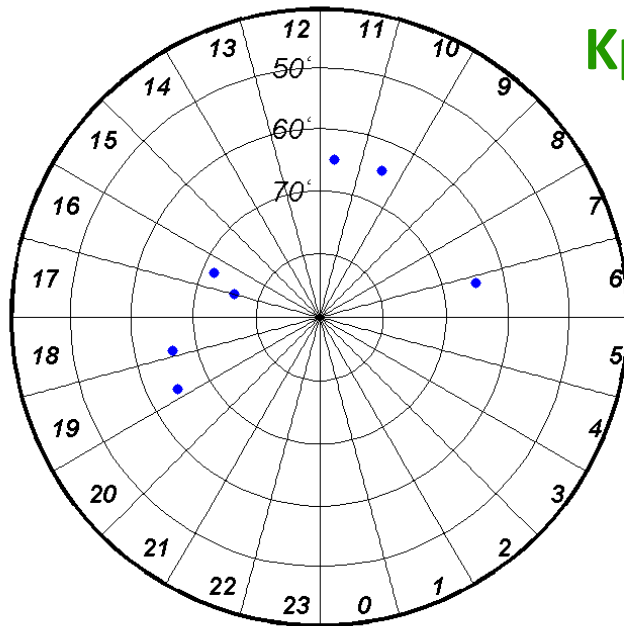


DMSP



DMSP Boundary Crossing(s) on 083101 at 12 UTC
Kp = 1.7

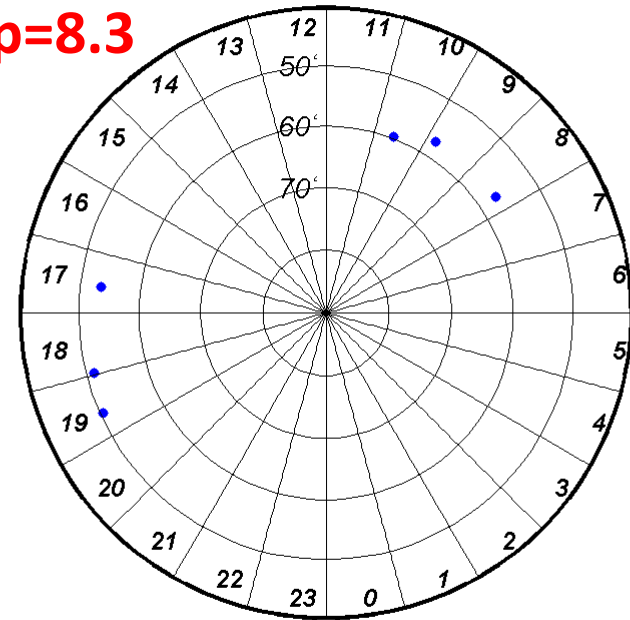
DMSP Boundary Crossing(s) on 051505 at 8 UTC
Kp = 8.3



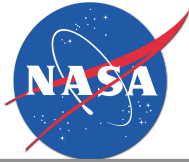
Kp=2

MLT Sectors
MLAT coordinates

Kp=8.3



- Up to 4 satellites contribute up to 8 points per 60 minute period
- Increased geomagnetic storming results in threshold crossings moving equatorward



Five Models for Comparison



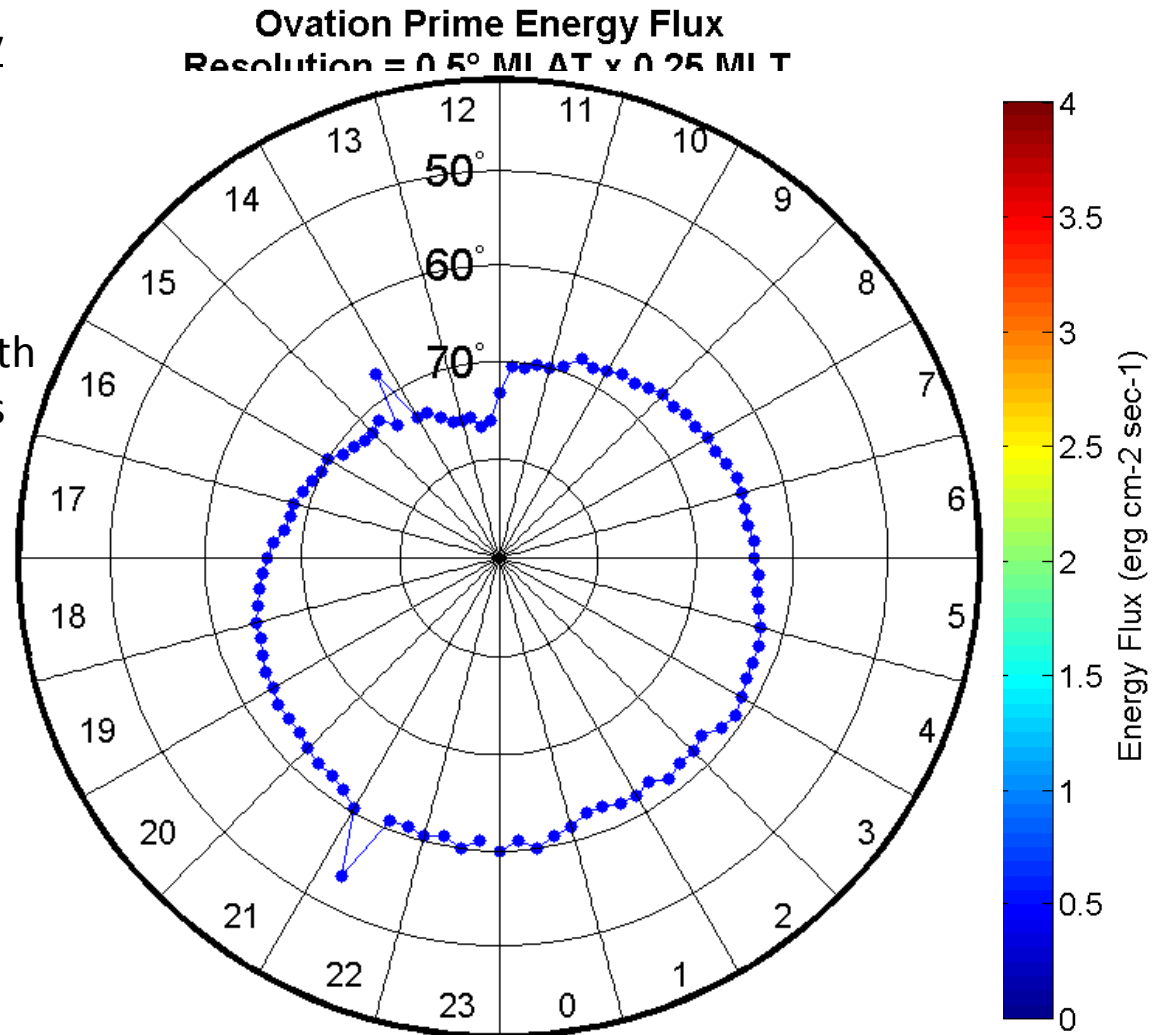
- Ovation Prime (OP)
- New Hardy (NH)
- Old Hardy (OH)
- SWMF – Fok-RC (SWMF)
- AMIE – (AMIE)

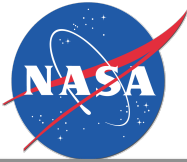


Ovation Prime



- Ovation Prime Boundary Plot
- 4 data points per MLT (3.75° spacing)
- In each MLT wedge, boundary is obtained with three consecutive values exceeding $0.4 \text{ erg/cm}^2/\text{s}$
- Observe:
 - Asymmetric
 - Anomalous
 - Small variations per minute
 - Strong K_p dependence

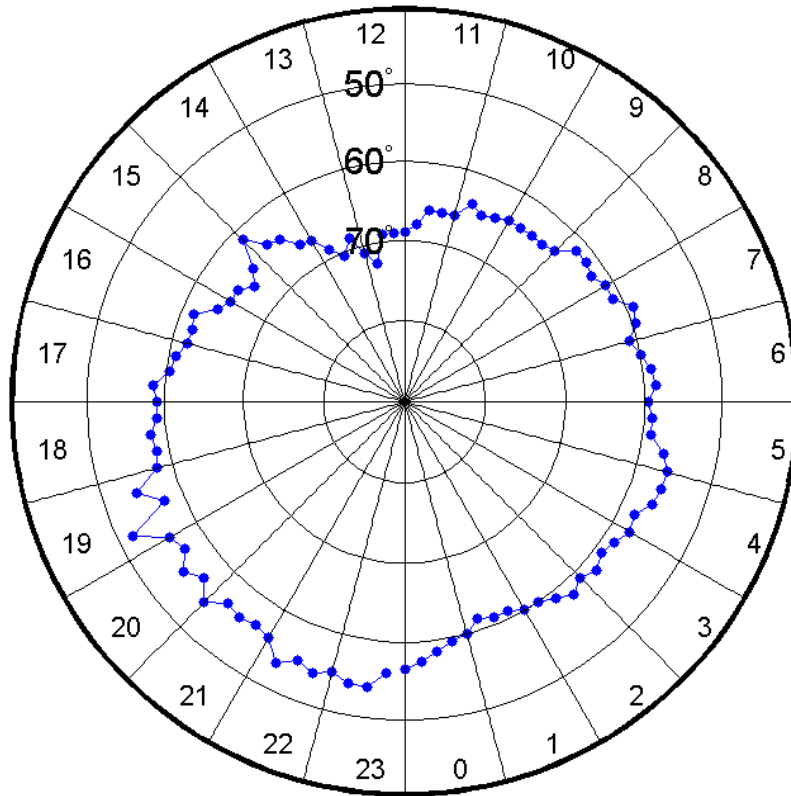




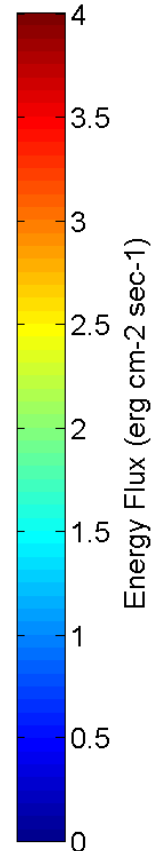
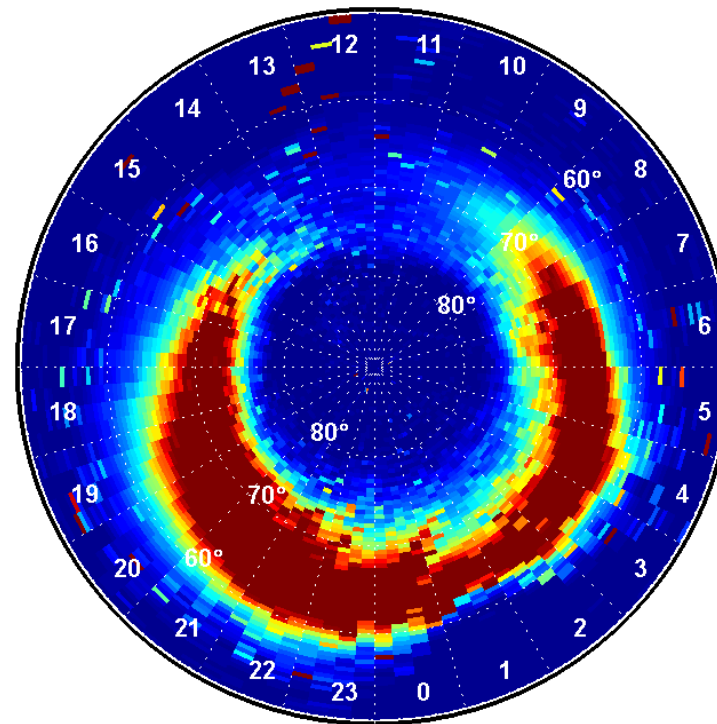
OP Boundary (Storming)

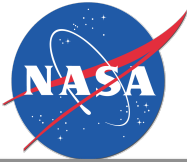


Ovation Prime Boundary on 083105 at 1501 UTC
Kp = 7.0



Ovation Prime Energy Flux
Resolution = 0.5° MLAT x 0.25 MLT

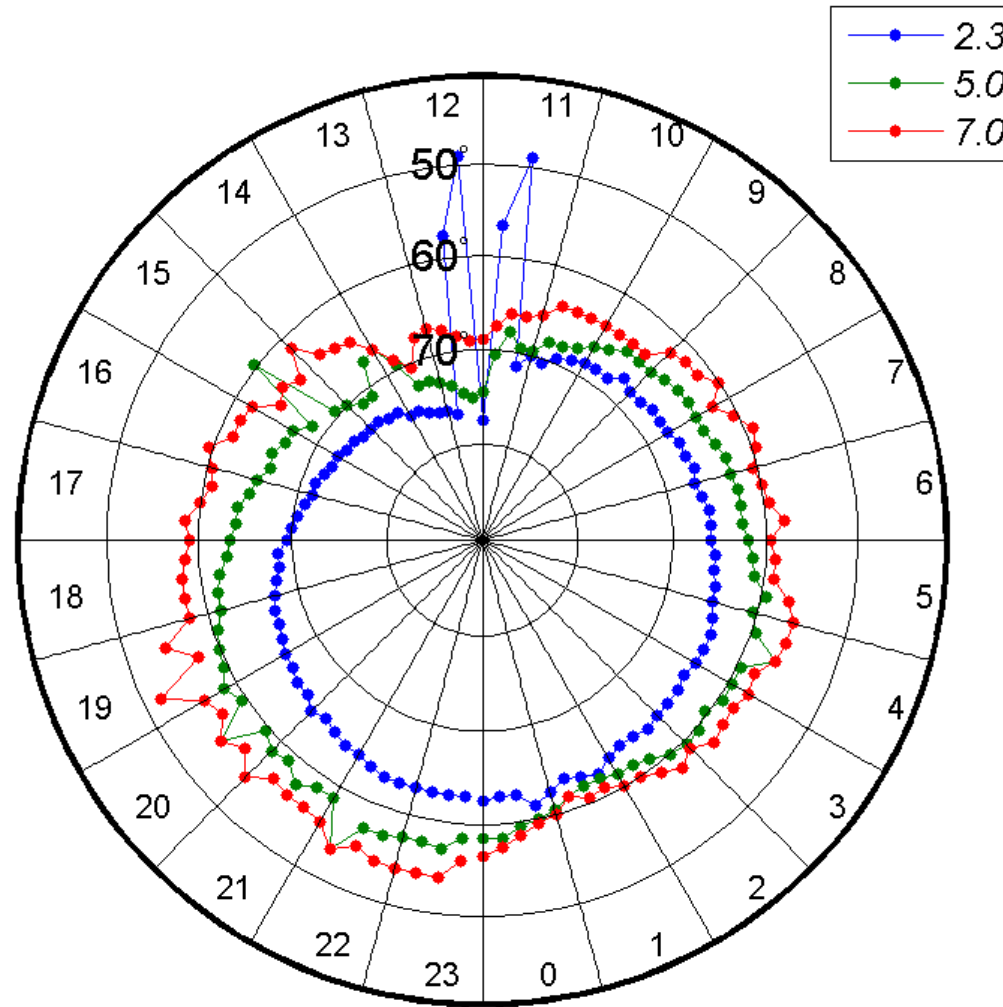




OP Boundary Morphology



Ovation Prime Boundary on 083105 at Various Kp Values



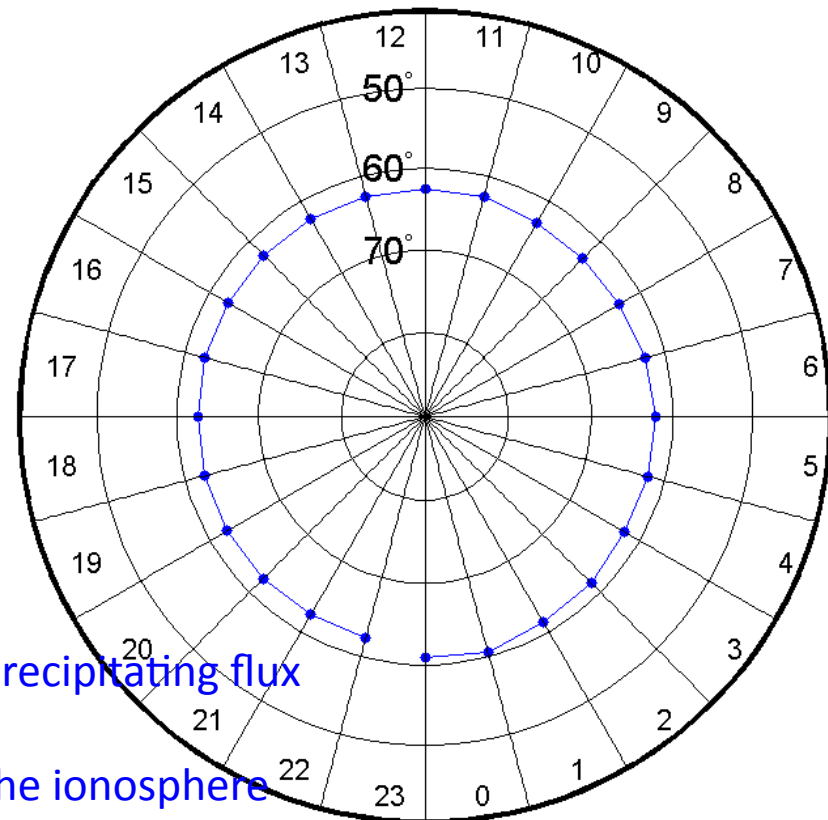


SWMF-Fok RC



- SWMF Model Boundary Plot
- One point per MLT (15° spacing)
- Boundary is automatically computed using CCMC algorithm
- Observe
 - High symmetry
 - Low Kp dependence / low variation in general

SWMF Boundary on 083101 at 12:35 UTC
Kp = 1.7



Note: from a crude method in calculating precipitating flux
Assuming strong pitch angle scattering
30% of ring current flux precipitating into the ionosphere

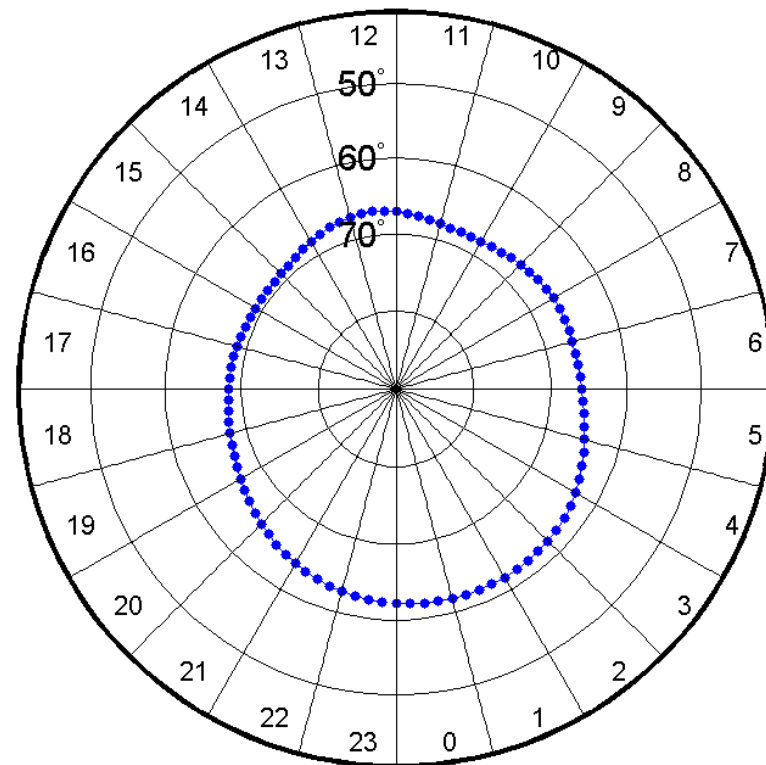
Mei-Ching: a refined method with realistic representation/calculation of precipitating flux



New Hardy (NH)



Hardy Model (new) Boundary $K_p = 1.0$

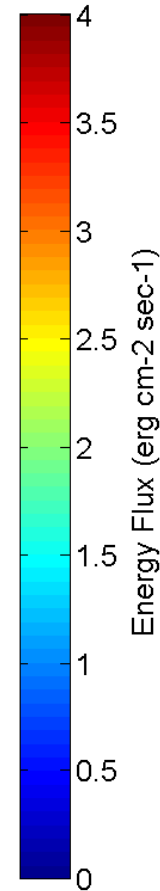
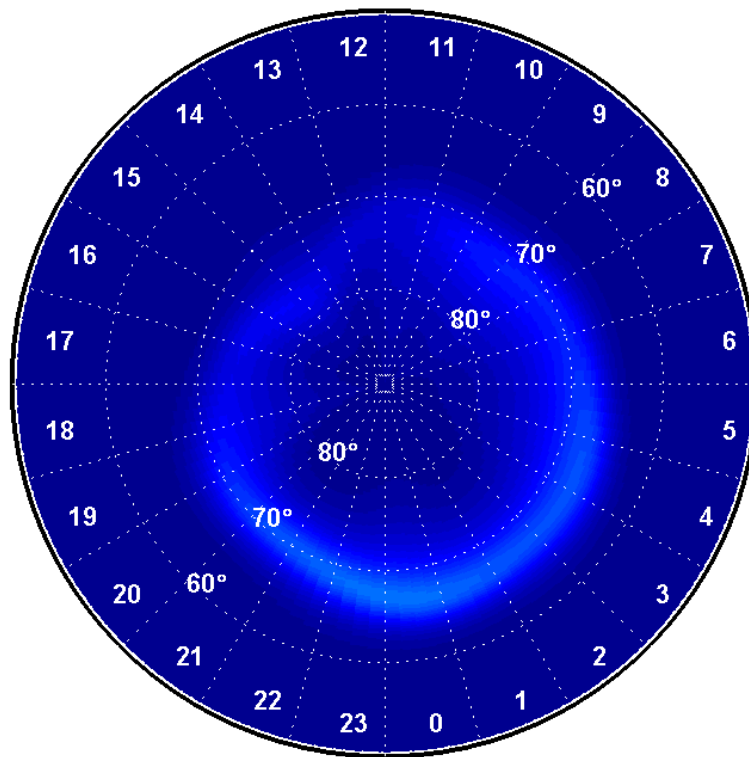




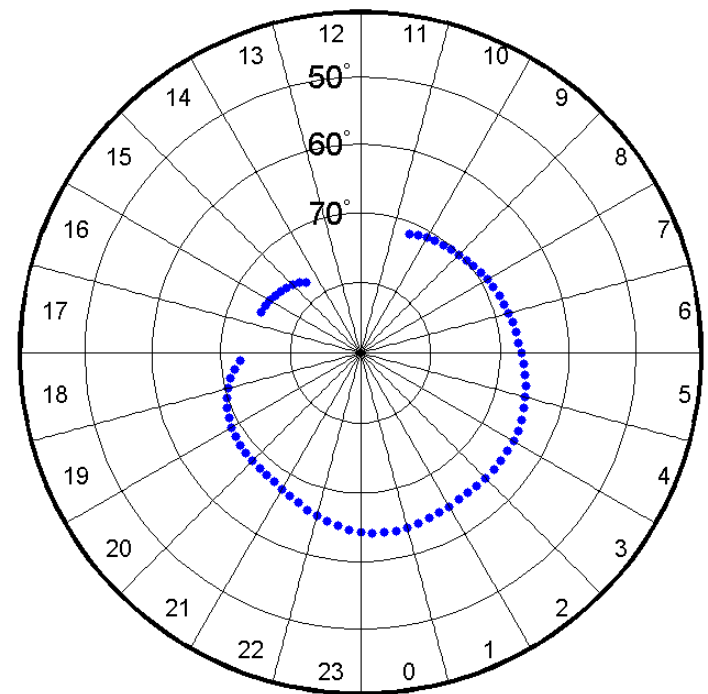
Old Hardy Kp 1



Hardy Energy Flux at Kp 1
Resolution = 0.1° MLAT x 0.25 MLT



Hardy Model (old) Boundary Kp = 1.0



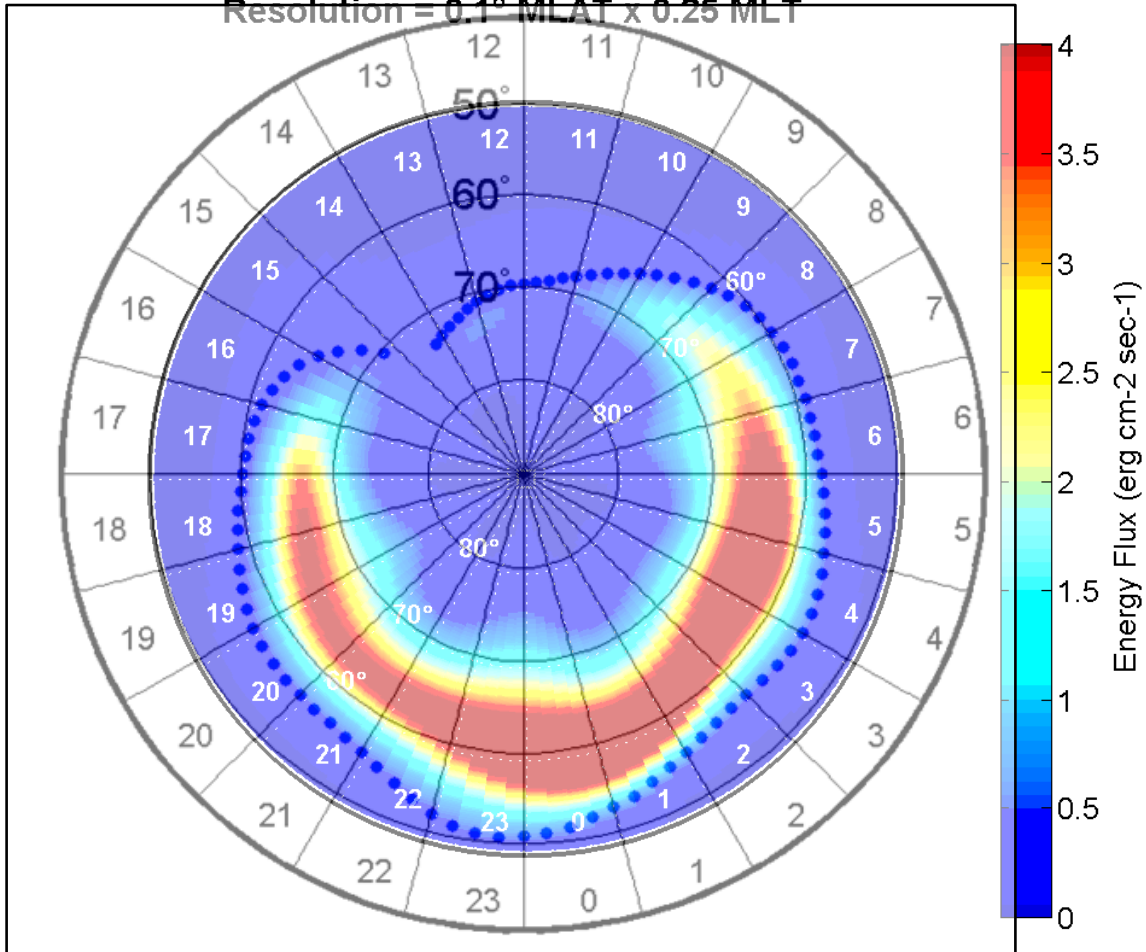


Old Hardy Kp 6



Hardy Energy Flux at Kp 6

Resolution = 0.1° MLAT x 0.25 MLT

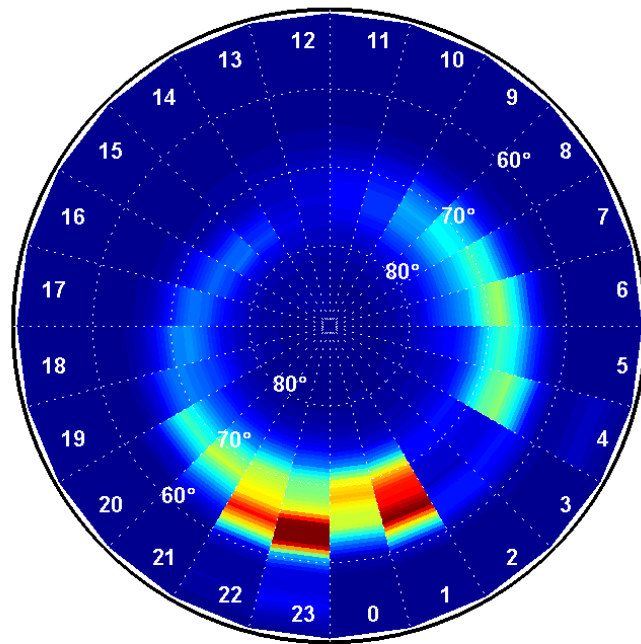




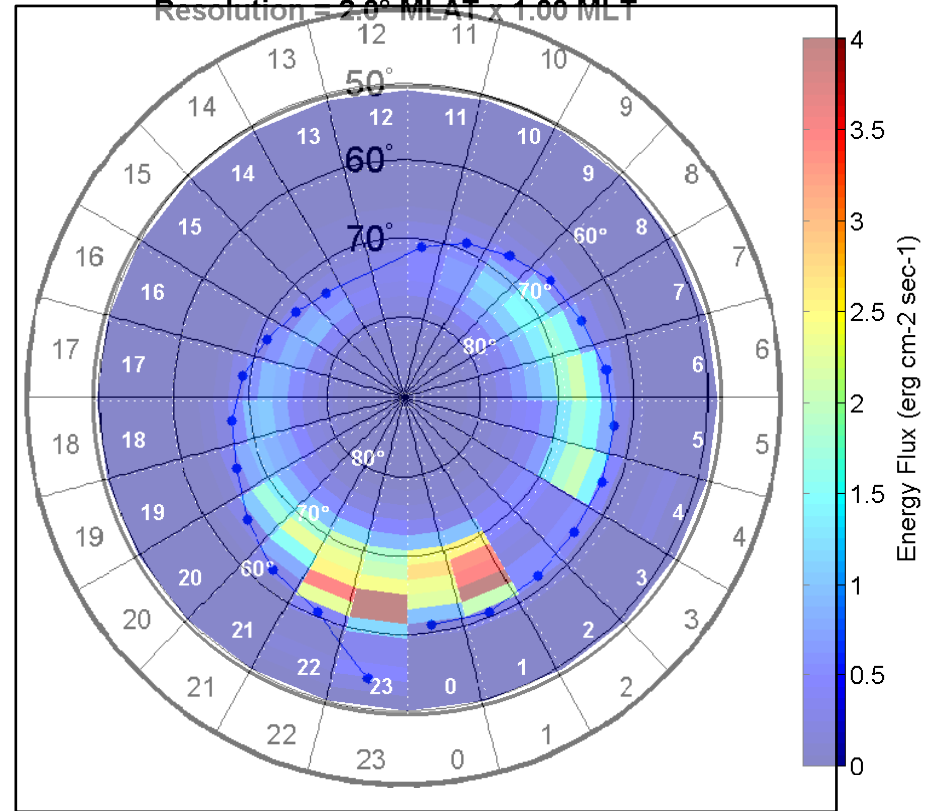
AMIE Data



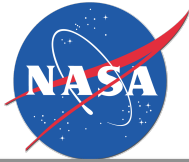
AMIE Energy Flux
Resolution = 0.5° MLAT x 1.00 MLT



AMIE Energy Flux
Resolution = 2.0° MLAT x 1.00 MLT



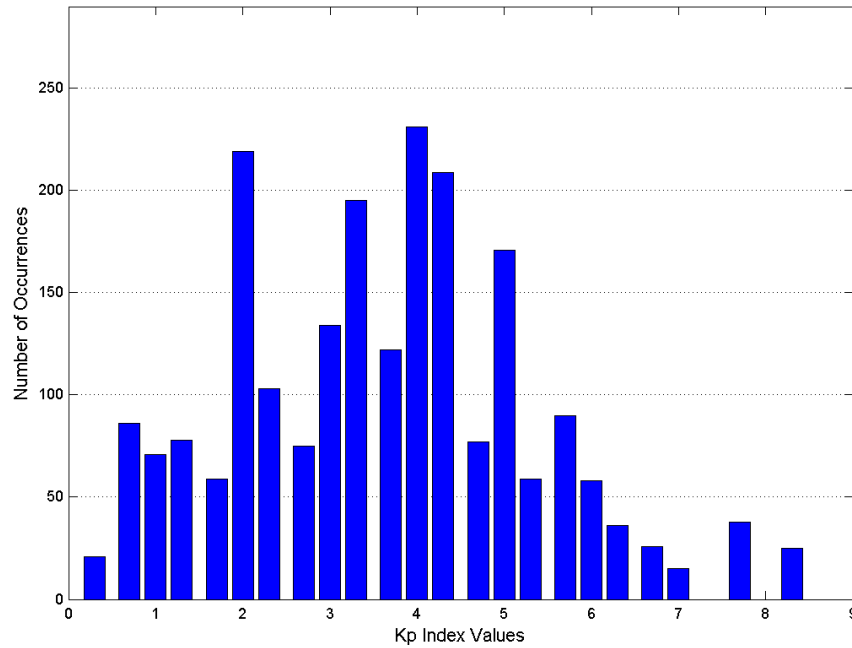
AMIE data is produced at a high cadence but with low spatial resolution. Interpolated plot is shown on the left.



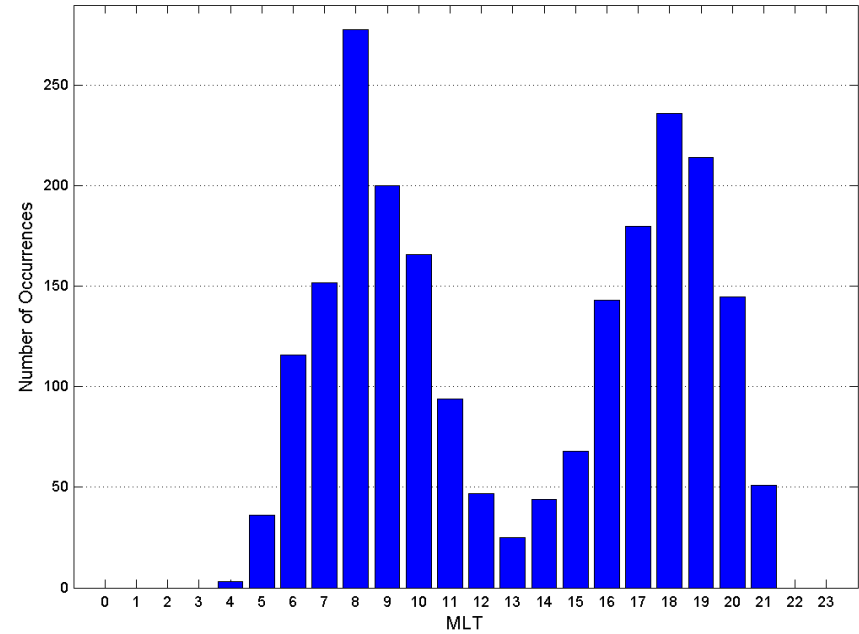
DMSP Crossings (0.4)

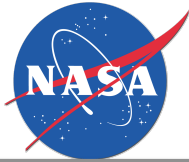


DMSP Crossing Distribution (Kp Index)
Threshold: 0.4
Total: 2198



DMSP Crossing Distribution (MLT)
Threshold: 0.4
Total: 2198



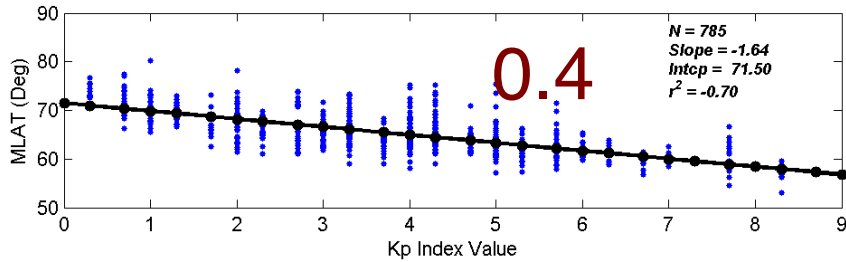


DMSPP Crossing Statistics

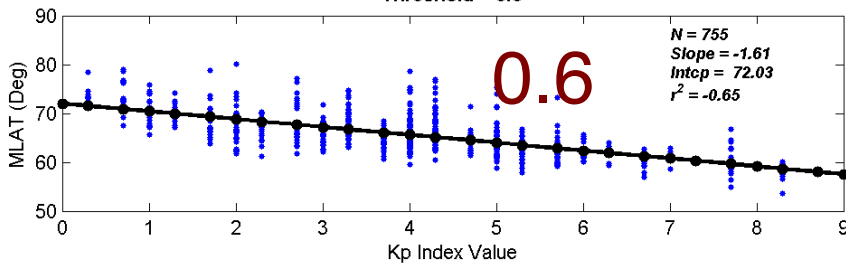


0400-0900 MLT

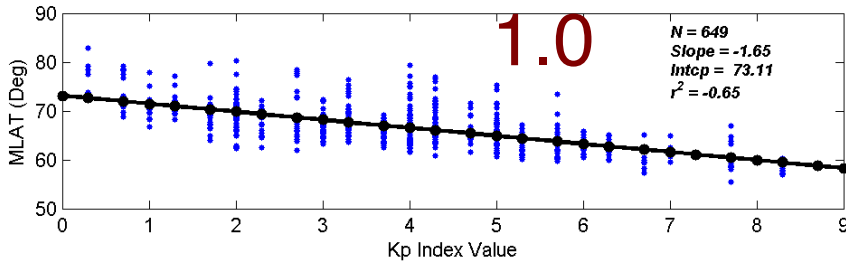
DMSPP Threshold Crossings
All Year
0400 - 0900 MLT
Threshold = 0.4



DMSPP Threshold Crossings
All Year
0400 - 0900 MLT
Threshold = 0.6

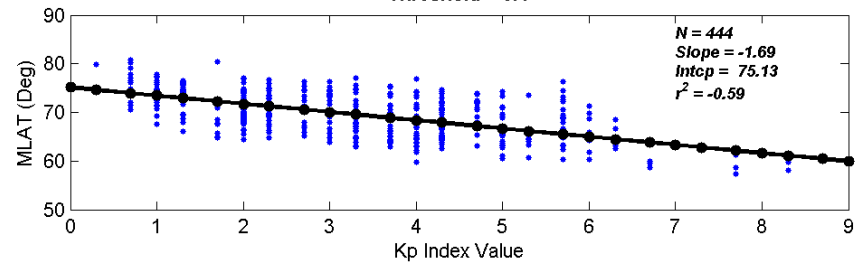


DMSPP Threshold Crossings
All Year
0400 - 0900 MLT
Threshold = 1.0

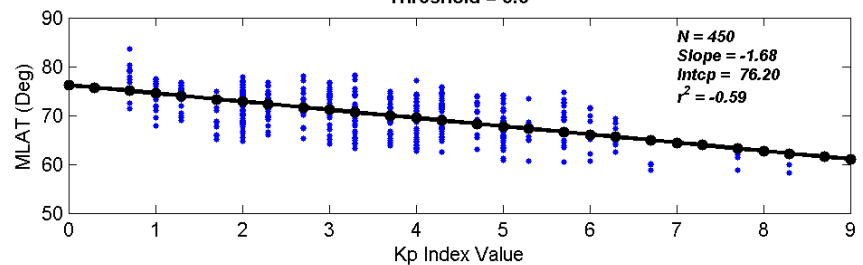


0900-1500 MLT

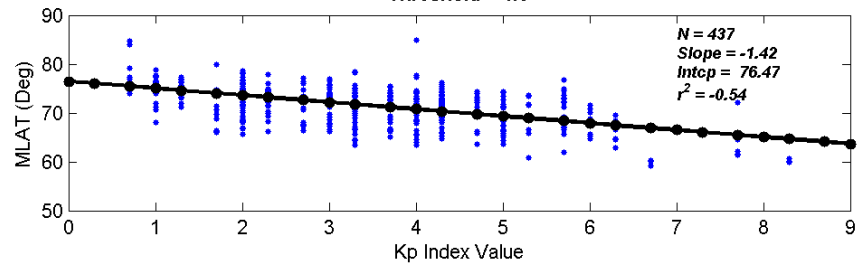
DMSPP Threshold Crossings
All Year
1000 - 1500 MLT
Threshold = 0.4

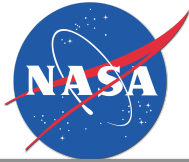


DMSPP Threshold Crossings
All Year
1000 - 1500 MLT
Threshold = 0.6



DMSPP Threshold Crossings
All Year
1000 - 1500 MLT
Threshold = 1.0

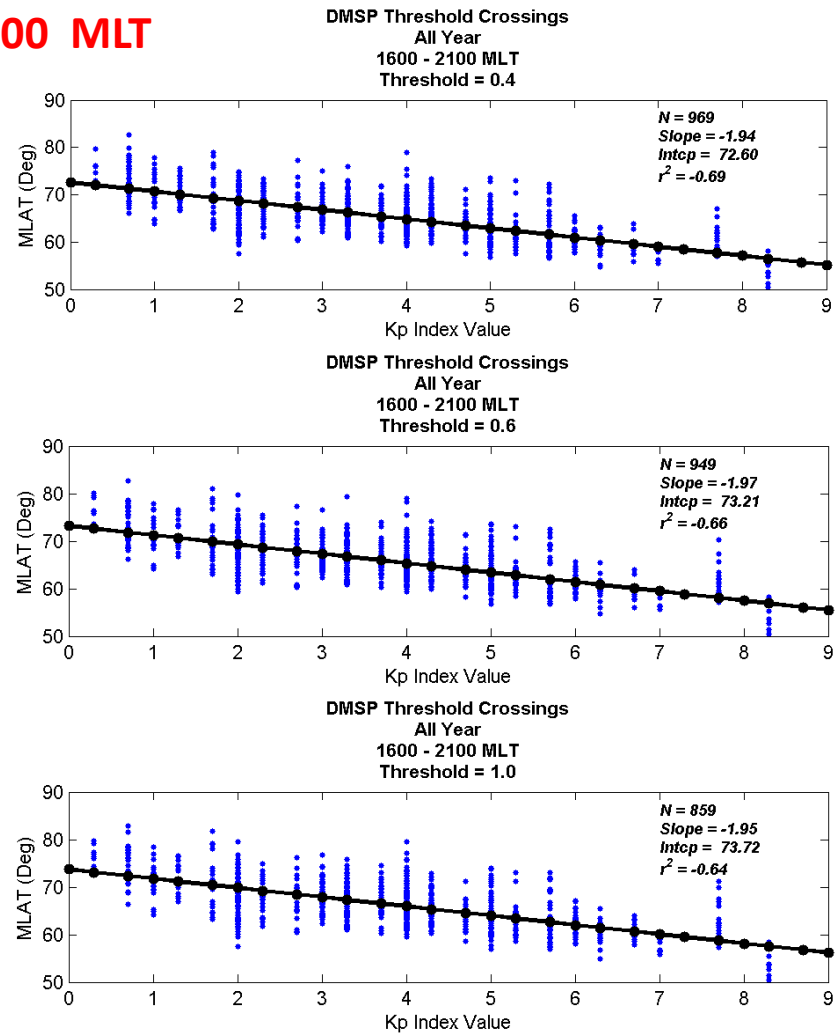




DMSPP Crossing Statistics



1600-2100 MLT



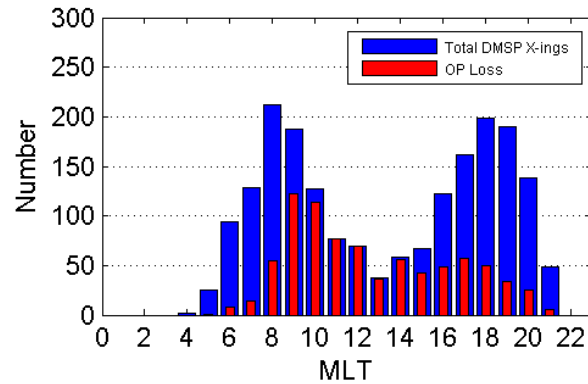


Data Losses

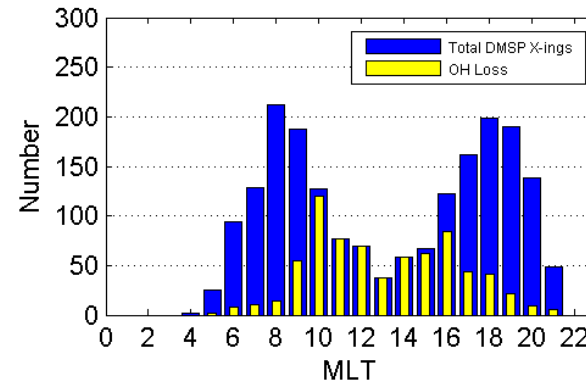
MLT (1.0 erg/cm²/sec)



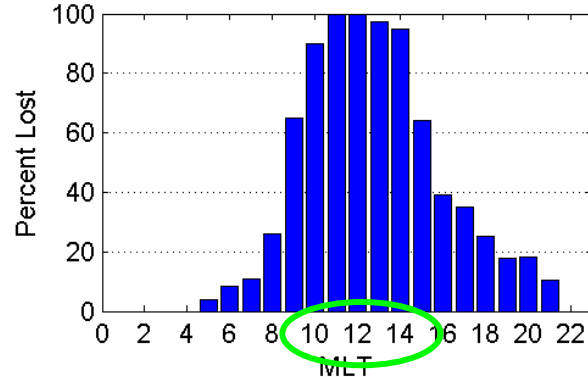
Distribution of MLTs
Losses Due to No OP Boundary (1.0)
Total Loss = 41.9 %



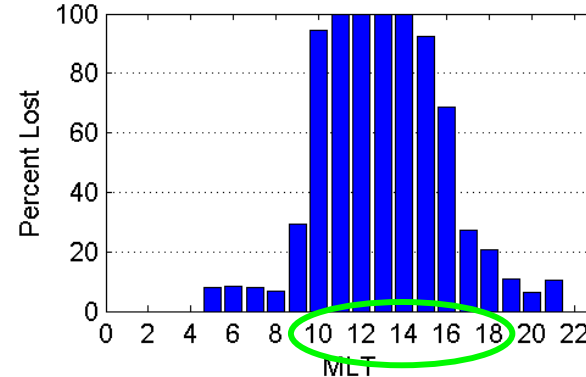
Distribution of MLTs
Losses Due to No OH Boundary (1.0)
Total Loss = 36.9 %



OP Percentage Loss



OH Percentage Loss





Analysis



- Analysis Formulas
 - Prediction Efficiency
 - 1 is perfect
 - 0 is worst
 - Skill Score
 - 1 is perfect
 - 0 is “no advantage”
 - Negative values indicate worse than reference (but not necessarily a bad result)
 - RMSE / DE / RE
 - MAE

$$PE = 1 - ARV$$

$$ARV = \frac{\sum_{i=1}^n (x_i - \hat{x}_i)^2}{\sum_{i=1}^n (x_i - \bar{x}_i)^2}$$

$x_i \rightarrow$ observations (DMSP)

$\hat{x}_i \rightarrow$ predictions (model)

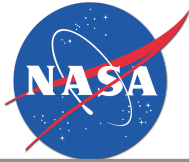
$$\frac{\sum_{i=1}^n (a_i - x_i)^2}{n}$$

$$SS = 1 - \frac{\sum_{i=1}^n (a_i - x_i)^2 / n}{\sum_{i=1}^n (b_i - x_i)^2 / n}$$

$x_i \rightarrow$ observations (DMSP)

$a_i \rightarrow$ forecast (OP)

$b_i \rightarrow$ reference (OH)



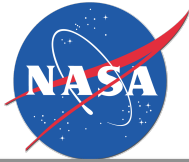
Prediction Efficiencies



Season: ALL ToD: ALL Kp: ALL									
0.4			0.6			1.0			
	N	Mean	PE	N	Mean	PE	N	Mean	PE
NH	2198	2.54	0.26	2154	3.17	0.13	1945	3.95	-0.06
OH	2059	0.16	0.51	1724	-0.01	0.39	1227	-0.19	0.35
OP	2122	1.16	0.55	1772	0.76	0.55	1130	-0.09	0.53

Season: ALL ToD: Dusk Kp: Various									
0.4			0.6			1.0			
	Low	Mid	High	Low	Mid	High	Low	Mid	High
NH	0.09	-0.14	0.02	-0.01	-0.24	0.1	-0.12	-0.41	0.12
OH	0.36	0.35	-0.04	0.13	0.4	0	-0.18	0.39	-0.14
OP	0.37	0.19	0.15	0.4	0.32	0.29	0.35	0.56	0.11

Season: ALL ToD: Dawn Kp: Various									
0.4			0.6			1.0			
	Low	Mid	High	Low	Mid	High	Low	Mid	High
NH	-0.65	-0.27	-0.24	-1.03	-0.49	-0.13	-1.14	-0.97	-0.17
OH	0.06	0.05	-0.57	-0.28	-0.04	-0.84	-0.49	0.15	-0.68
OP	0.1	0.3	-0.1	0.2	0.18	-0.21	0.32	0.3	-0.46

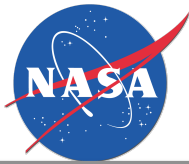


Cumulative Comps (0.4)



Seas	TOD	Kp	Mod	Num	Mean	Std		PE	RMSE	DE	CI1	RE	CI2	Num	SS
All Seas	All TOD	All Kp	OP	2122	1.16	2.94		0.55	3.16	1.16	0.13	1.02	0.002		
All Seas	All TOD	All Kp	OH	2059	0.16	3.12		0.51	3.12	0.16	0.13	1.00	0.002		
All Seas	All TOD	All Kp	NH	2198	2.54	3.22		0.26	4.1	2.54	0.13	1.04	0.002	2018	0.01
All Seas	All TOD	All Kp	SWMF	426	3.39	4.21		-0.03	5.4	3.39	0.4	1.06	0.006		
All Seas	All TOD	All Kp	AMIE	849	3.29	4.49		-0.24	5.56	3.29	0.3	1.05	0.005		

- OP has the best Prediction Efficiency and OH closely follows.
- OH has a regression line that closely approximates 1:1.
- The SS between OH and OP demonstrates no decisive advantage to either model.
- SWMF and AMIE do not perform well (worse than using the mean).



Cumulative Comps (0.4)



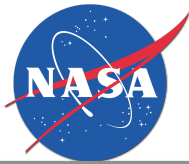
Seas	TOD	Kp	Mod	Num	Mean	Std	Num	PE	RMSE	DE	CI1	RE	CI2
All Seas	All TOD	Low Kp	OP	1319	0.97	2.96	1319	0.3	3.11	0.97	0.16	1.02	0.003
All Seas	All TOD	Low Kp	OH	1315	0.51	3.02	1315	0.31	3.06	0.51	0.16	1.01	0.003

Seas	TOD	Kp	Mod	Num	Mean	Std	Num	PE	RMSE	DE	CI1	RE	CI2
All Seas	All TOD	Mid Kp	OP	663	1.97	2.67	663	0.37	3.32	1.97	0.2	1.03	0.003
All Seas	All TOD	Mid Kp	OH	604	-0.28	3.14	604	0.34	3.15	-0.28	0.25	1	0.004

Seas	TOD	Kp	Mod	Num	Mean	Std	Num	PE	RMSE	DE	CI1	RE	CI2
All Seas	All TOD	High Kp	OP	140	-0.88	2.68	140	0.13	2.82	-0.88	0.44	0.99	0.007
All Seas	All TOD	High Kp	OH	140	-1.25	3.34	140	-0.39	3.55	-1.25	0.55	0.98	0.009

- These conclusions hold true at Low and Mid Kp values.
- At high Kp values, both models suffer.
- SWMF provides the best PE at during High Kp conditions.

Seas	TOD	Kp	Mod	Num	Mean	Std	Num	PE	RMSE	DE	CI1	RE	CI2
All Seas	All TOD	High Kp	SWMF	103	-0.36	2.43	103	0.29	2.45	-0.35	0.47	0.99	0.008
All Seas	All TOD	High Kp	OP	140	-0.88	2.68	140	0.13	2.82	-0.88	0.44	0.99	0.007
All Seas	All TOD	High Kp	NH	140	-0.72	2.94	140	0	3.01	-0.72	0.49	0.99	0.008
All Seas	All TOD	High Kp	OH	140	-1.25	3.34	140	-0.39	3.55	-1.25	0.55	0.98	0.009
All Seas	All TOD	High Kp	AMIE	115	0.81	4.1	115	-0.98	4.16	0.81	0.76	1.01	0.013



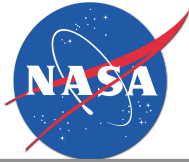
Seasonal Comps (0.4)



Seas	TOD	Kp	Mod	Num	Mean	Std	Num	PE	RMSE	DE	CI1	RE	CI2
WI	All TOD	All Kp	OP	478	0.74	2.82	478	0.64	2.91	0.74	0.25	1.01	0.004
WI	All TOD	All Kp	OH	460	0.46	3.01	460	0.58	3.04	0.46	0.28	1.01	0.004
WI	All TOD	All Kp	NH	498	2.76	3.16	498	0.28	4.2	2.76	0.28	1.04	0.004
WI	All TOD	All Kp	SWMF	187	2.78	3.56	187	-0.05	4.51	2.78	0.51	1.05	0.008
WI	All TOD	All Kp	AMIE	260	4.06	5.44	260	-0.79	6.78	4.06	0.66	1.07	0.011

Seas	TOD	Kp	Mod	Num	Mean	Std	Num	PE	RMSE	DE	CI1	RE	CI2
SU	All TOD	All Kp	OP	663	1.34	2.9	663	0.65	3.2	1.34	0.22	1.02	0.003
SU	All TOD	All Kp	OH	623	-0.12	3.47	623	0.52	3.47	-0.12	0.27	1	0.004
SU	All TOD	All Kp	NH	687	2.55	3.76	687	0.3	4.54	2.55	0.28	1.04	0.004
SU	All TOD	All Kp	AMIE	414	2.57	3.43	414	0.24	4.28	2.57	0.33	1.04	0.005
SU	All TOD	All Kp	SWMF	164	4.15	4.7	164	-0.22	6.25	4.15	0.72	1.07	0.011

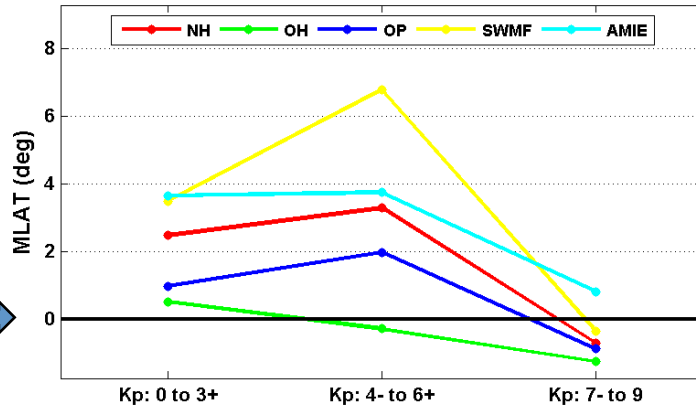
- Ovation Prime has the highest PE when seasonal dependence is investigated.



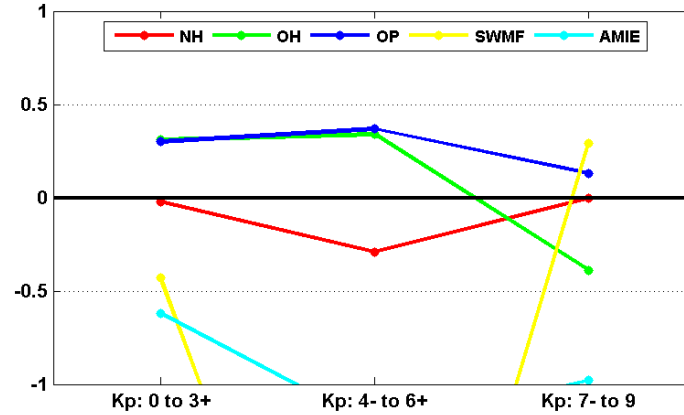
Metrics – All Models



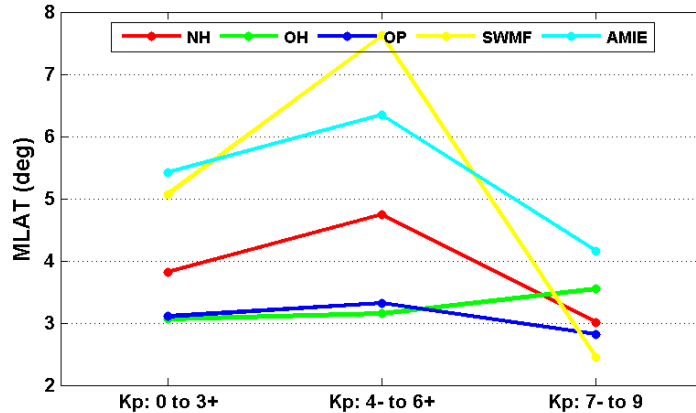
Mean Deviation from DMSP Data
All Seasons // All MLTs
Threshold = 0.4



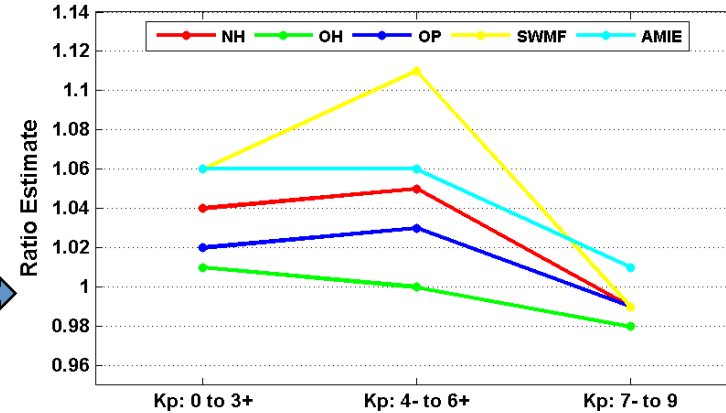
Prediction Efficiencies
All Seasons // All MLTs
Threshold = 0.4



Root Mean Square Error
All Seasons // All MLTs
Threshold = 0.4



Ratio Estimates
All Seasons // All MLTs
Threshold = 0.4





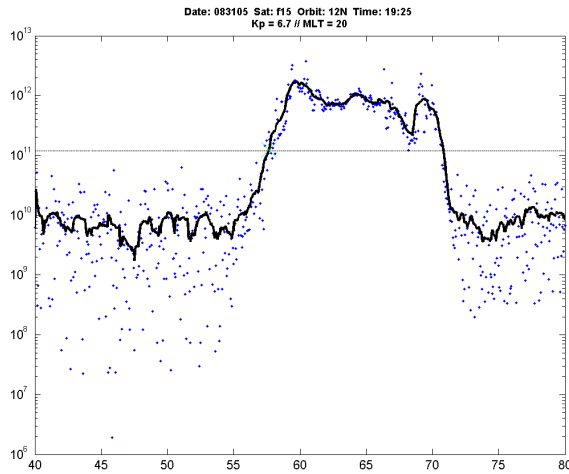
Results Summary



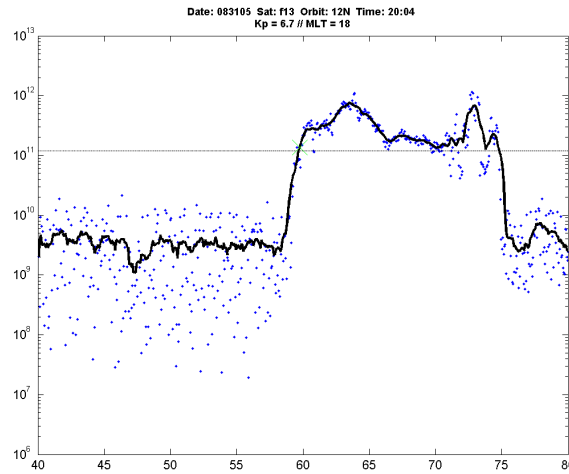
- OP has the best Prediction Efficiency and OH closely follows.
- OH has a regression line that closely approximates 1:1.
- The SS between OH and OP demonstrates no decisive advantage to either model.
- SWMF and AMIE do not perform well (worse than using the mean).
- These conclusions hold true at Low and Mid Kp values.
- At high Kp values, OH and OP suffer.
- SWMF provides the best PE at during High Kp conditions.



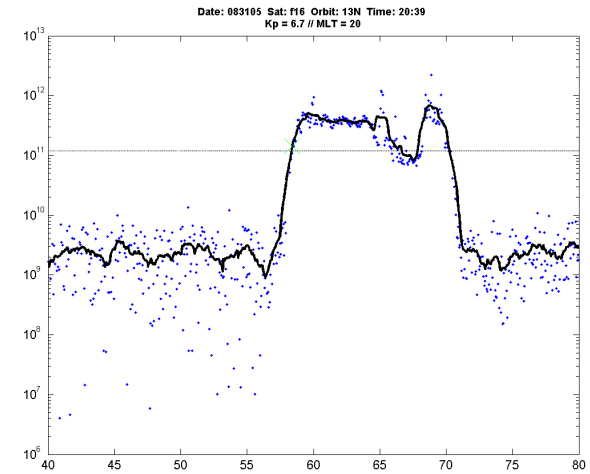
DMSP Time Series



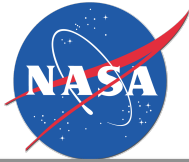
1925 UTC
20 MLT
f15



2004 UTC
18 MLT
f13



2039 UTC
20 MLT
f16



Model Performance along the satellite track

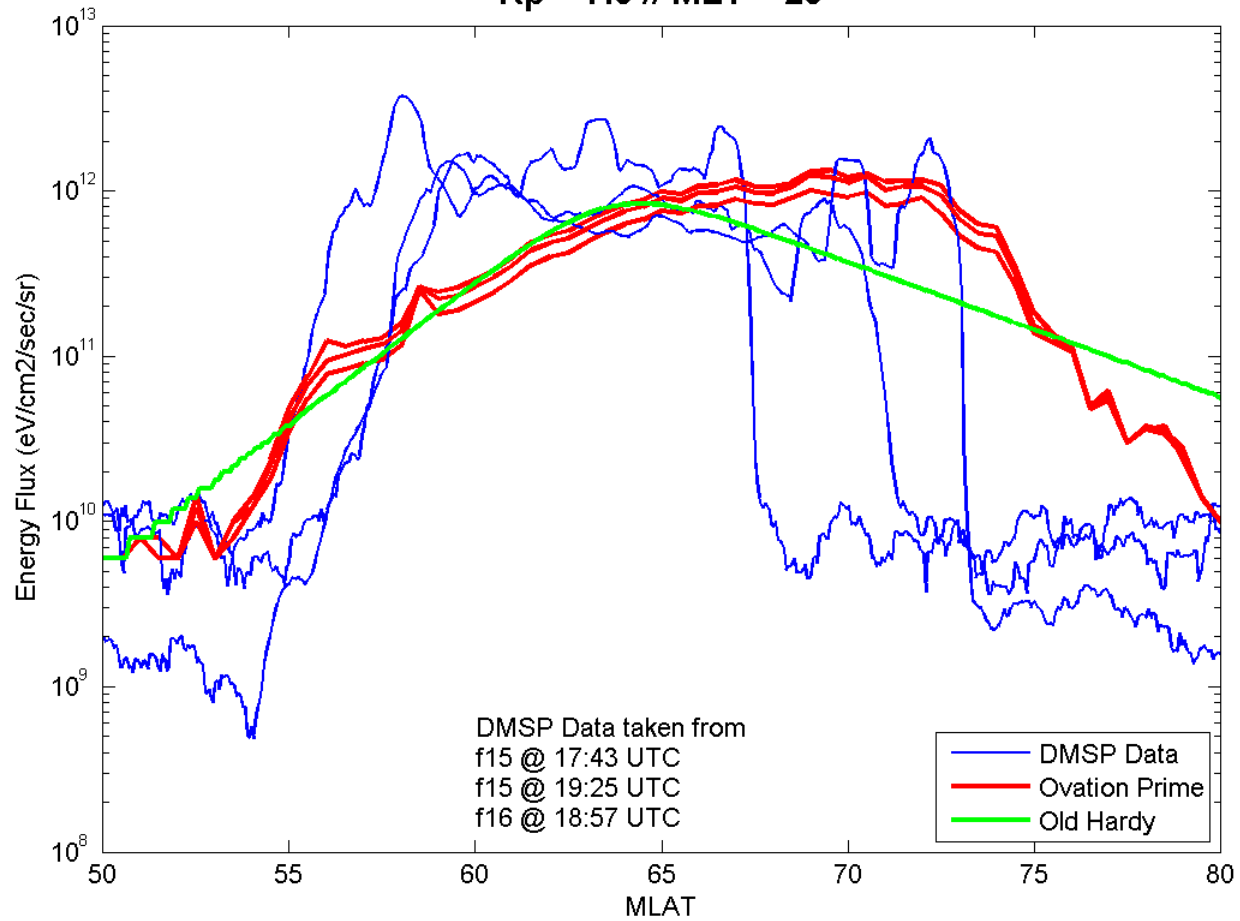
aurora with clean boundaries

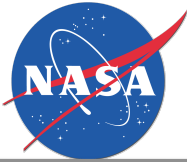


Satellite Data Comparison to Model

Date: 083105

Kp = 7.0 // MLT = 20





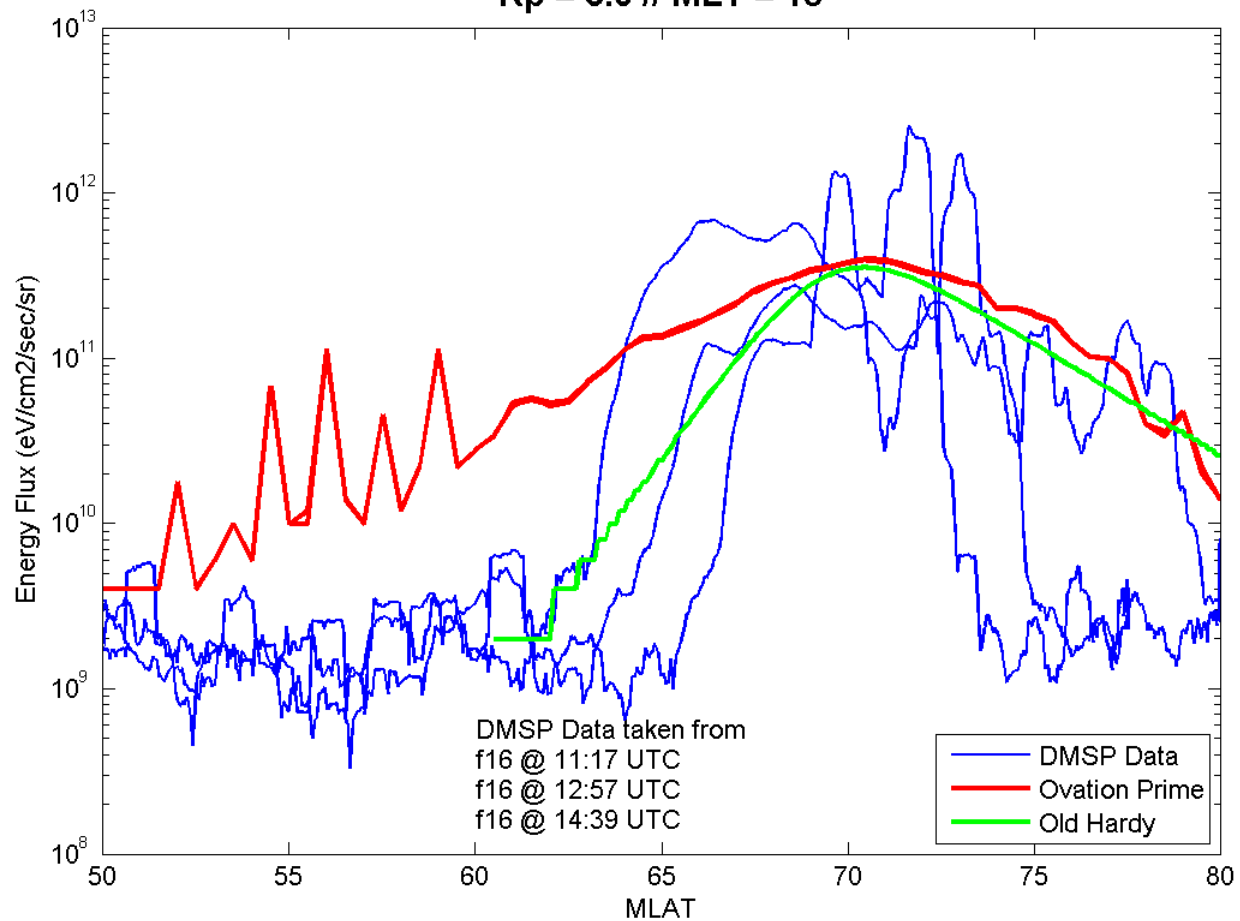
Model Performance along the satellite track aurora with clean boundaries

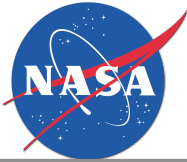


Satellite Data Comparison to Model

Date: 071105

Kp = 3.0 // MLT = 18





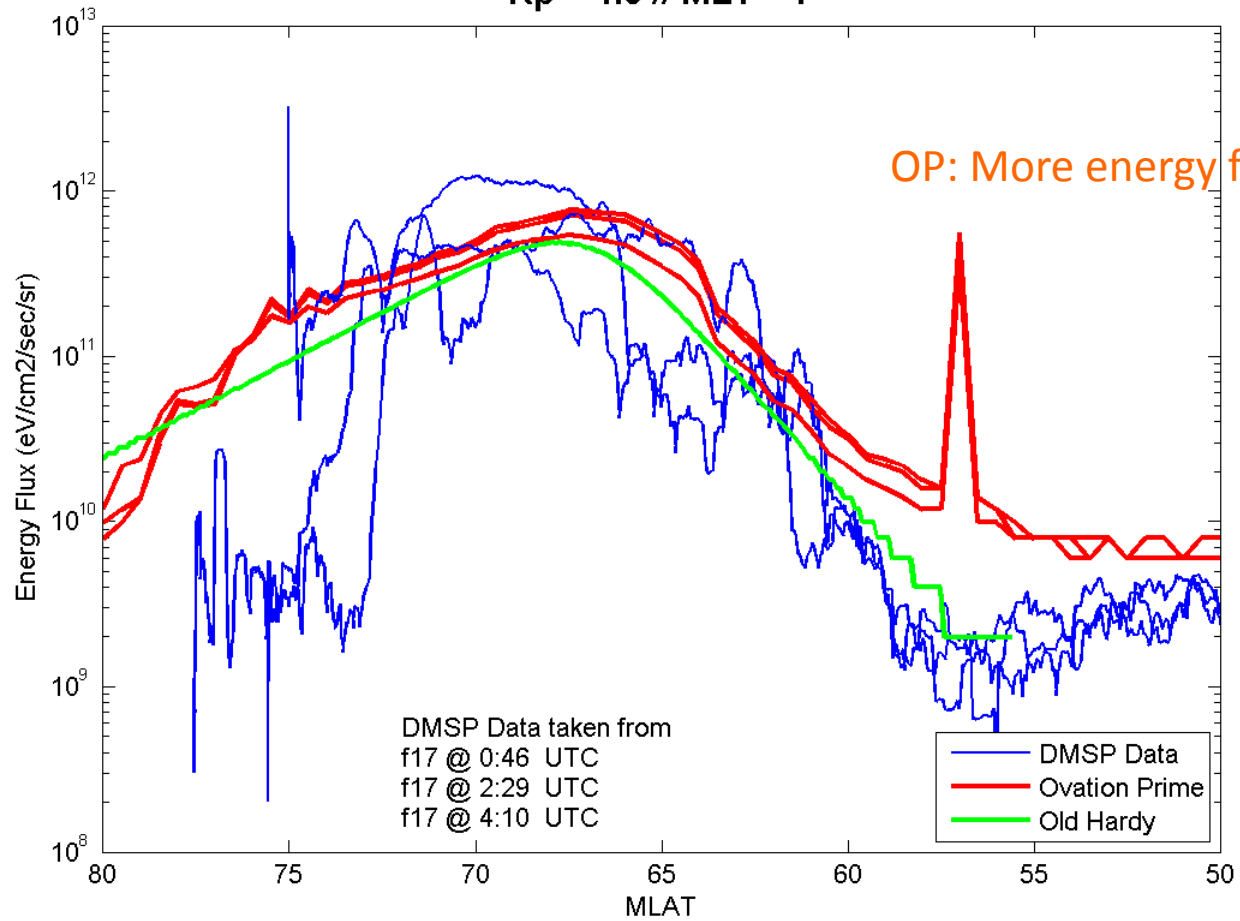
Model Performance for a specific crossing



Satellite Data Comparison to Model

Date: 032808

Kp = 4.0 // MLT = 7





Measure of Performance future direction



- How well models do in capturing spatial features for a fixed time?
 - e.g., the MLT feature

correlation in MLT binned by activity level
or for a specific time

standard deviation of the boundary offset

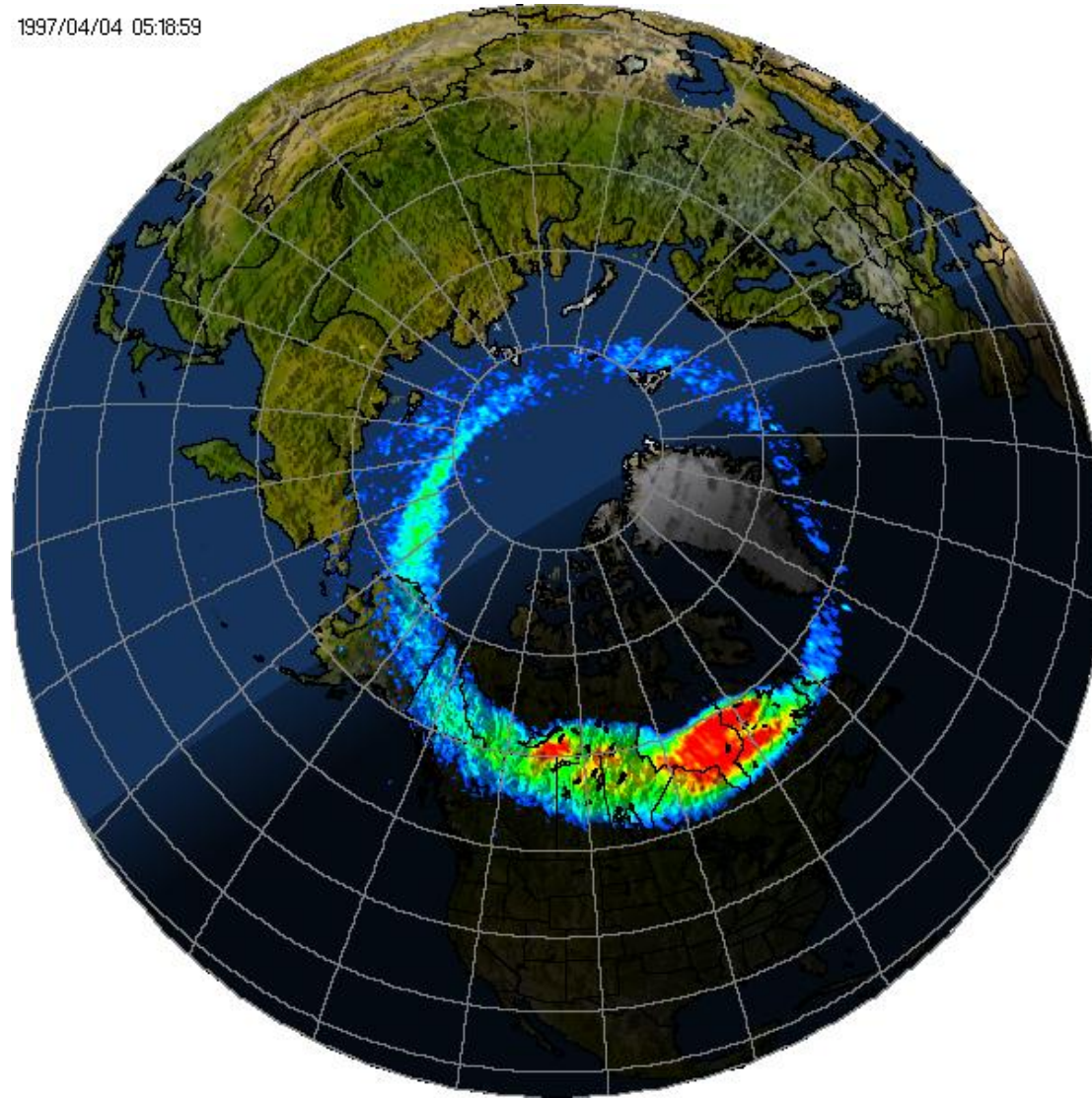
Observations: auroral imaging



Aurora Imaging Observations



1997/04/04 05:18:59



Polar UVI



IMAGE/FUV

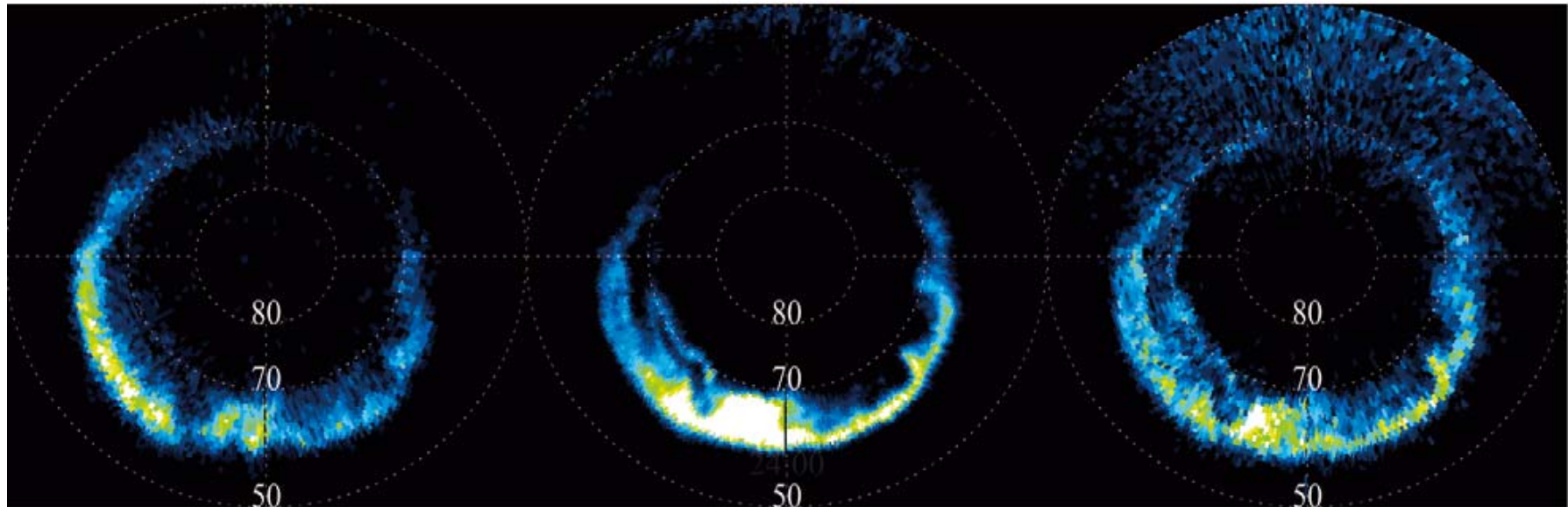


AFIT
AIR FORCE INSTITUTE OF TECHNOLOGY

SI-12 Image

WIC Image

SI-13 Image



1 30 60 ≥ 90
S12 Counts



500 1333 2166 ≥ 3000
WIC A-D Units



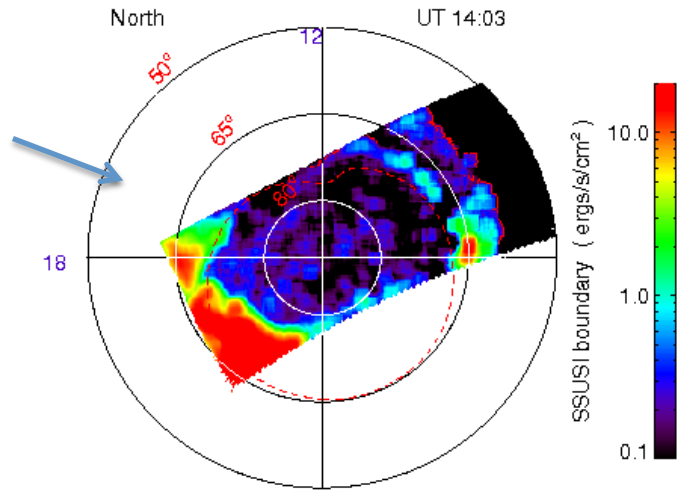
1 17 33 ≥ 50
S13 Counts



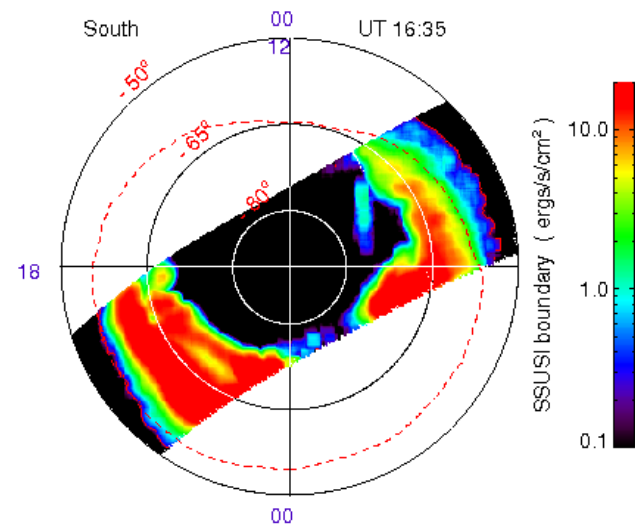
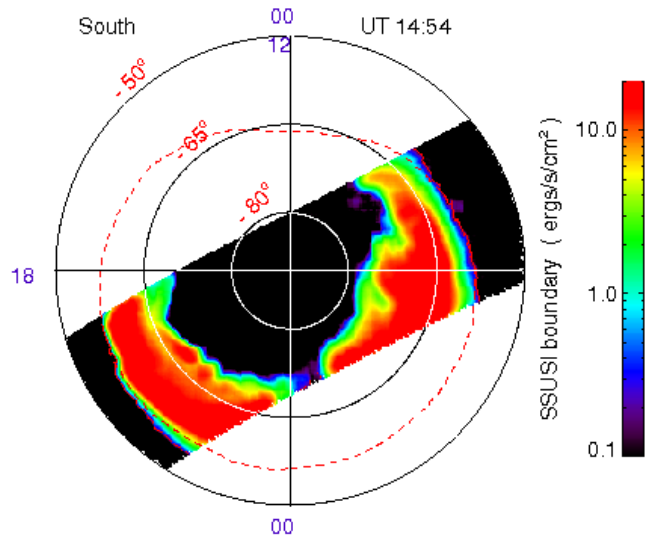
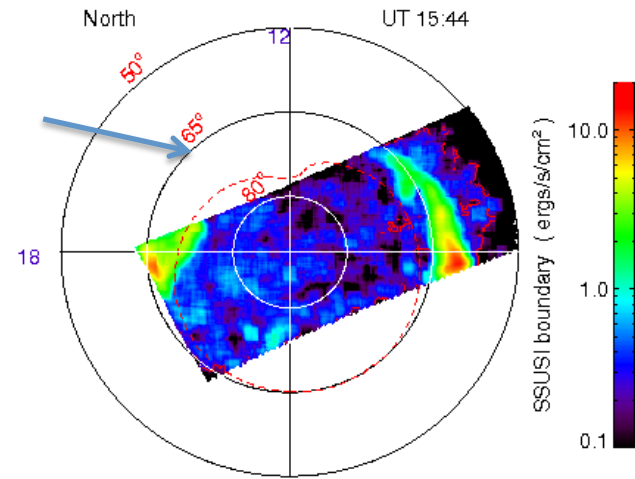
DMSP/SUSI

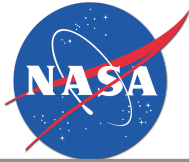


August 31, 2005 DOY:243 Orbit: 09646 (DMSPF16)



August 31, 2005 DOY:243 Orbit: 09647 (DMSPF16)





Validation using constant energy flux



For obtaining the equatorward boundary

A: 0.4 ergs/cm²/s

B: 0.6 ergs/cm²/s

C: 1.0 ergs/cm²/s

- DMSP particle flux
- DMSP SSUSI: threshold 0.4 ergs/cm²/s
- Ovation Prime: threshold 0.4 ergs/cm²/s
- SWMF+Fok RC
- Weimer
 - 1 erg=10.⁽⁻⁷⁾ joule
 - 1 eV=1.6*10.⁽⁻¹⁹⁾ joule
 - Threshold 0.4 ergs/cm²/s =2.5*10¹¹ eV/cm²/s

DMSP unit: eV/cm²/s/sr

Limit= 8.0*10¹⁰ eV/cm²/s/sr