



# Comparison of Costello Geomagnetic Activity Index Model and JHU/APL Models for Kp Prediction

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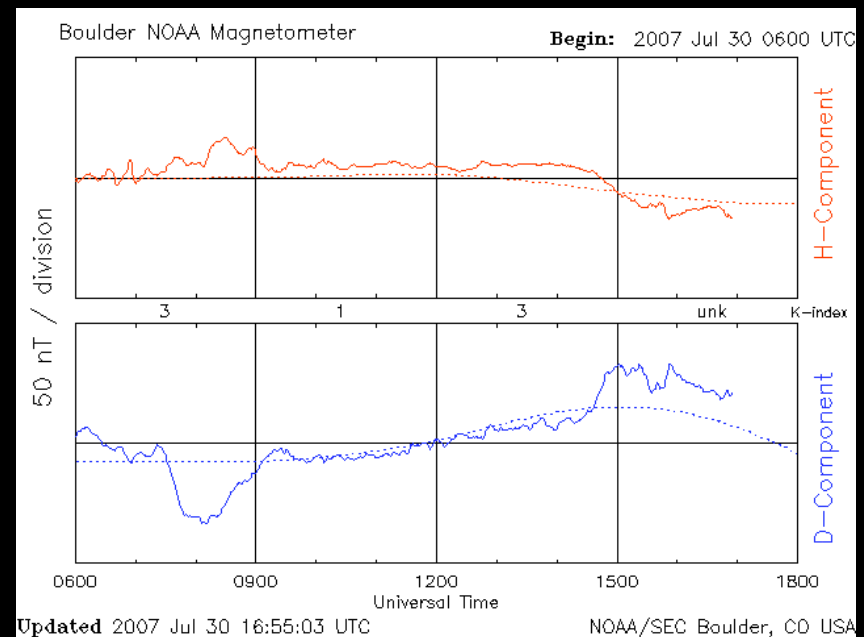
# Outline

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- Background
- Kp Prediction
- Costello Geomagnetic Activity Index Model
  - Validation Studies
- Research
- Results
- JHU/APL Models
- Conclusions

# Kp Index

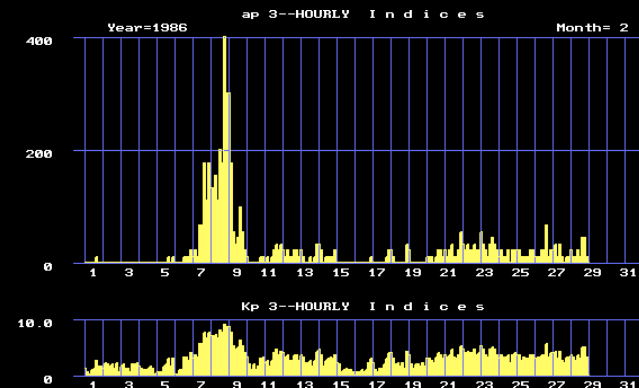
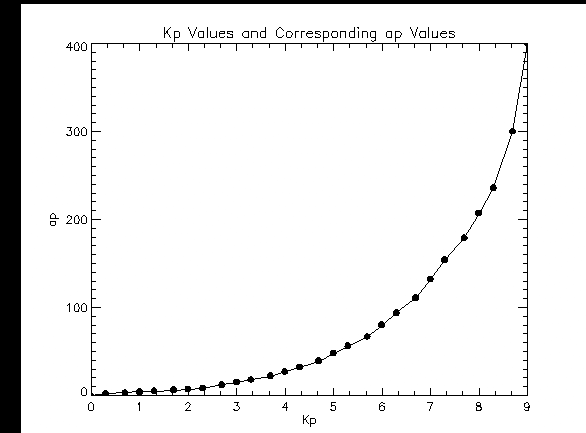
- Developed by Julius Bartels
- Measure of the maximum disturbances in the horizontal components of Earth's magnetic field caused by solar particle radiation
- Official index calculated every three hours using observations from 13 subauroral magnetometer stations



# Kp Values

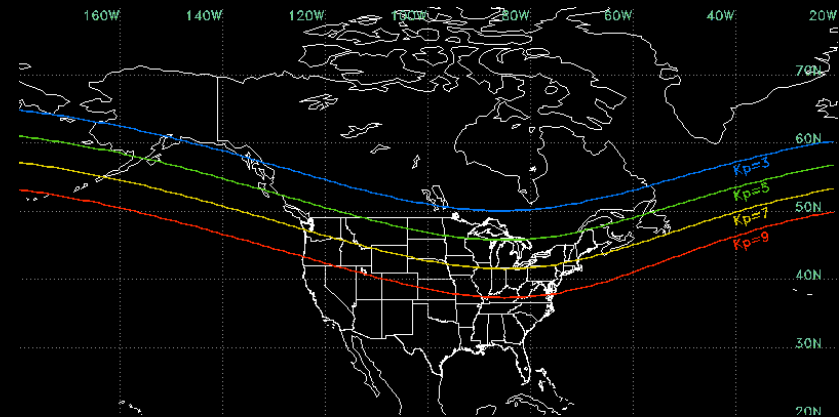
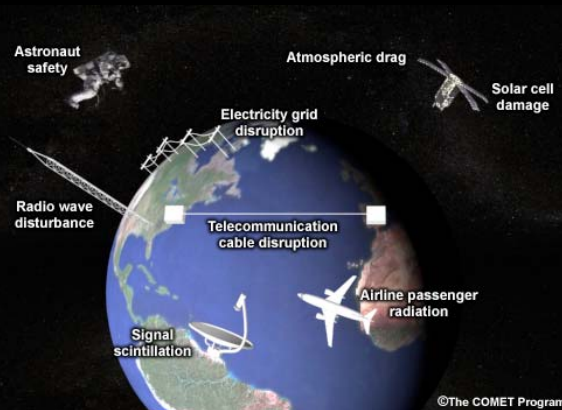
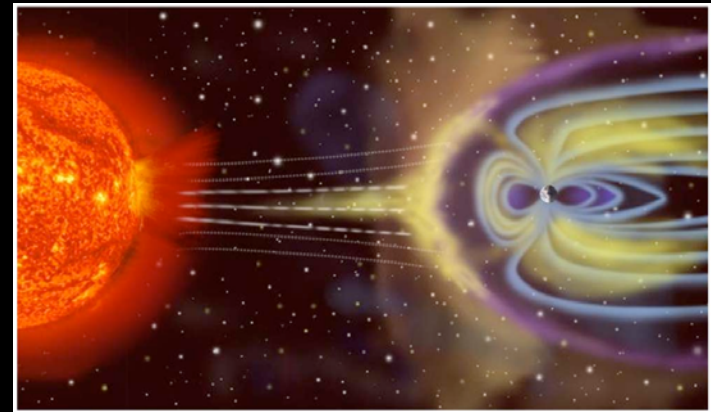
- Range from 0 to 9 in a scale of thirds
- Kp value of 0 corresponds to the quietest conditions
- Kp value of 9 corresponds to the most disturbed conditions
- Quasi-logarithmic scale
- ap index ranges from 0 to 400 and represents the Kp value converted to a linear scale in nT

Kp	Numerical Value	ap (nT)
0	0.0	0
0+	0.3	2
1-	0.7	3
1	1.0	4
1+	1.3	5
2-	1.7	6
2	2.0	7
2+	2.3	9
3-	2.7	12
3	3.0	15
3+	3.3	18
4-	3.7	22
4	4.0	27
4+	4.3	32
5-	4.7	39
5	5.0	48
5+	5.3	56
6-	5.7	67
6	6.0	80
6+	6.3	94
7-	6.7	111
7	7.0	132
7+	7.3	154
8-	7.7	179
8	8.0	207
8+	8.3	236
9-	8.7	300
9	9.0	400



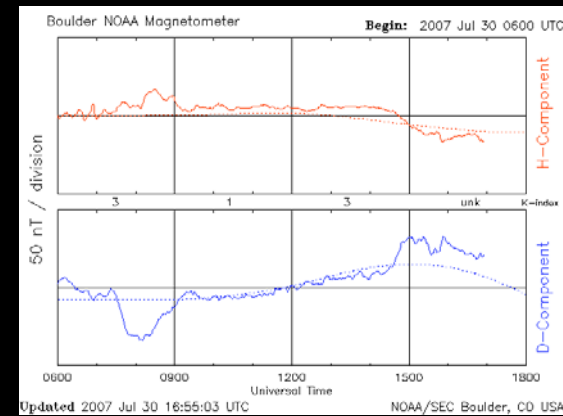
# Effects of Geomagnetic Storms

- Disrupt radio communications
- Disrupt GPS navigation
- Damage transformers and electric power grids
- Degrade satellite instrumentation
- Increase satellite drag
- Cause aurora
- Confuse racing pigeons



# NOAA Space Weather Scales

Category	Effect	Physical measure	Average Frequency (1 cycle = 11 years)
<b>Geomagnetic Storms</b>			
G5	<p><b>Extreme</b></p> <p>Major systems, including voltage control problems and protective system problems can occur, some grid systems may experience complete collapse or blackouts. Transformers may experience damage. International operations may experience extensive outages. Longitudinal problems with navigation, signal disturbance and tracking satellites.</p> <p>Other systems: protection currents can reach hundreds of amps, HF (high frequency) radio propagation may be degraded in many areas for one to two days, satellite navigation may be degraded for days, low-frequency radio propagation can be lost for hours, and aurora has been seen as low as Florida and western Texas (typical HF propagation is 3000 miles).</p>	<p>Kp index<sup>a</sup></p> <p>8<sup>+</sup></p> <p>1 per cycle (14 days per cycle)</p>	<p>Number of storm main phase 10 days and greater (number of storm days)</p> <p>1 per cycle (14 days per cycle)</p>
G4	<p><b>Severe</b></p> <p>Major systems, including voltage control problems and protective system will experience significant problems. Some grid systems may experience complete collapse or blackouts. Transformers may experience damage. International operations may experience extensive outages. Longitudinal problems with navigation, signal disturbance and tracking satellites. Corrective actions may be required for ground control, possible changes in drug affect other products.</p> <p>Other systems: HF radio propagation can be lost for hours, and aurora has been seen as low as California and western Colorado (typical HF propagation is 3000 miles).</p>	<p>Kp index<sup>a</sup>, including a 5-</p> <p>8</p> <p>100 per cycle (100 days per cycle)</p>	<p>100 per cycle (100 days per cycle)</p>
G3	<p><b>Strong</b></p> <p>Major systems, including voltage control problems and protective system will experience significant problems. Some grid systems may experience complete collapse or blackouts. Transformers may experience damage. International operations may experience extensive outages. Longitudinal problems with navigation, signal disturbance and tracking satellites. Corrective actions may be required for ground control, possible changes in drug affect other products.</p> <p>Other systems: HF radio propagation can be lost for hours, and aurora has been seen as low as New York and Idaho (typical HF propagation is 3000 miles).</p>	<p>Kp index<sup>a</sup></p> <p>7</p> <p>200 per cycle (200 days per cycle)</p>	<p>200 per cycle (200 days per cycle)</p>
G2	<p><b>Moderate</b></p> <p>Major systems, including voltage control problems and protective system will experience significant problems. Some grid systems may experience complete collapse or blackouts. Transformers may experience damage. International operations may experience extensive outages. Longitudinal problems with navigation, signal disturbance and tracking satellites. Corrective actions may be required for ground control, possible changes in drug affect other products.</p> <p>Other systems: HF radio propagation can be lost for hours, and aurora has been seen as low as New York and Idaho (typical HF propagation is 3000 miles).</p>	<p>Kp index<sup>a</sup></p> <p>6</p> <p>600 per cycle (600 days per cycle)</p>	<p>600 per cycle (600 days per cycle)</p>
G1	<p><b>Minor</b></p> <p>Major systems, including voltage control problems and protective system will experience significant problems. Some grid systems may experience complete collapse or blackouts. Transformers may experience damage. International operations may experience extensive outages. Longitudinal problems with navigation, signal disturbance and tracking satellites. Corrective actions may be required for ground control, possible changes in drug affect other products.</p> <p>Other systems: HF radio propagation can be lost for hours, and aurora has been seen as low as New York and Idaho (typical HF propagation is 3000 miles).</p>	<p>Kp index<sup>a</sup></p> <p>5</p> <p>1700 per cycle (1700 days per cycle)</p>	<p>1700 per cycle (1700 days per cycle)</p>
<p><sup>a</sup> Based on the average Kp index for the storm. For the physical measure, see the NOAA Space Weather Scales website.</p> <p><sup>b</sup> For the storm, based on the Kp index, see the NOAA Space Weather Scales website.</p>			
<b>Solar Radiation Storms</b>			
S5	<p><b>Extreme</b></p> <p>Highly ionizing solar radiation based on estimates on EVA (space vehicle activity), passengers and crew in high-flying aircraft at high latitudes may be exposed to radiation risk. ***</p> <p>Satellite operations: satellites may be rendered useless, sensory inputs can cause loss of control, may cause severe damage to some data, the tracker may be unable to locate objects, increased damage to solar panels possible.</p> <p>Other systems: complete blackout of HF (high frequency) communications possible through the polar regions, and previous errors make navigation operations extremely difficult.</p>	<p>Flux level of a 10<sup>10</sup> protons/cm<sup>2</sup></p> <p>10<sup>5</sup></p>	<p>Number of storm main phase 10 days and greater (number of storm days)</p> <p>From less than 1 per cycle</p>
S4	<p><b>Severe</b></p> <p>Highly ionizing solar radiation based on estimates on EVA (space vehicle activity), passengers and crew in high-flying aircraft at high latitudes may be exposed to radiation risk. ***</p> <p>Satellite operations: satellites may be rendered useless, sensory inputs can cause loss of control, may cause severe damage to some data, the tracker may be unable to locate objects, increased damage to solar panels possible.</p> <p>Other systems: complete blackout of HF (high frequency) communications possible through the polar regions, and previous errors make navigation operations extremely difficult.</p>	<p>Flux level of a 10<sup>10</sup> protons/cm<sup>2</sup></p> <p>10<sup>4</sup></p>	<p>1 per cycle</p>
S3	<p><b>Strong</b></p> <p>Highly ionizing solar radiation based on estimates on EVA (space vehicle activity), passengers and crew in high-flying aircraft at high latitudes may be exposed to radiation risk. ***</p> <p>Satellite operations: satellites may be rendered useless, sensory inputs can cause loss of control, may cause severe damage to some data, the tracker may be unable to locate objects, increased damage to solar panels possible.</p> <p>Other systems: complete blackout of HF (high frequency) communications possible through the polar regions, and previous errors make navigation operations extremely difficult.</p>	<p>Flux level of a 10<sup>10</sup> protons/cm<sup>2</sup></p> <p>10<sup>3</sup></p>	<p>10 per cycle</p>
S2	<p><b>Moderate</b></p> <p>Highly ionizing solar radiation based on estimates on EVA (space vehicle activity), passengers and crew in high-flying aircraft at high latitudes may be exposed to radiation risk. ***</p> <p>Satellite operations: satellites may be rendered useless, sensory inputs can cause loss of control, may cause severe damage to some data, the tracker may be unable to locate objects, increased damage to solar panels possible.</p> <p>Other systems: complete blackout of HF (high frequency) communications possible through the polar regions, and previous errors make navigation operations extremely difficult.</p>	<p>Flux level of a 10<sup>10</sup> protons/cm<sup>2</sup></p> <p>10<sup>2</sup></p>	<p>25 per cycle</p>
S1	<p><b>Minor</b></p> <p>Highly ionizing solar radiation based on estimates on EVA (space vehicle activity), passengers and crew in high-flying aircraft at high latitudes may be exposed to radiation risk. ***</p> <p>Satellite operations: satellites may be rendered useless, sensory inputs can cause loss of control, may cause severe damage to some data, the tracker may be unable to locate objects, increased damage to solar panels possible.</p> <p>Other systems: complete blackout of HF (high frequency) communications possible through the polar regions, and previous errors make navigation operations extremely difficult.</p>	<p>Flux level of a 10<sup>10</sup> protons/cm<sup>2</sup></p> <p>10<sup>1</sup></p>	<p>50 per cycle</p>
<p><sup>a</sup> For less than 1 storm per year. For a particular year, see the NOAA Space Weather Scales website.</p> <p><sup>b</sup> These events can be used for the year.</p> <p><sup>c</sup> For the storm, based on the Kp index, see the NOAA Space Weather Scales website.</p> <p><sup>d</sup> For the storm, based on the Kp index, see the NOAA Space Weather Scales website.</p>			
<b>Radio Blackouts</b>			
R5	<p><b>Extreme</b></p> <p>HF Radio: Complete HF (high frequency) radio blackout on the entire main side of the Earth for a number of hours. This includes all HF radio contact with satellites and all other systems in this sector.</p> <p>Other systems: Low-frequency navigation signals used by maritime and general aviation systems experience significant degradation. Degradation of satellite navigation signals used by maritime and general aviation systems is possible for several hours on the main side of Earth, which may spread into the night side.</p>	<p>CCO (Ch10<sup>10</sup>)</p>	<p>From less than 1 per cycle</p>
R4	<p><b>Severe</b></p> <p>HF Radio: HF radio communication blackout on most of the main side of Earth for one to two hours. HF radio (except low during the day).</p> <p>Other systems: Degradation of low-frequency navigation signals used by maritime and general aviation systems is possible for one to two hours. Other: Degradation of satellite navigation signals on the main side of Earth.</p>	<p>S10 (Ch10<sup>10</sup>)</p>	<p>2 per cycle (2 days per cycle)</p>
R3	<p><b>Strong</b></p> <p>HF Radio: HF radio communication blackout on most of the main side of Earth for about an hour on main side of Earth.</p> <p>Other systems: Degradation of low-frequency navigation signals used by maritime and general aviation systems is possible for one to two hours. Other: Degradation of satellite navigation signals on the main side of Earth.</p>	<p>S11 (Ch10<sup>10</sup>)</p>	<p>170 per cycle (170 days per cycle)</p>
R2	<p><b>Moderate</b></p> <p>HF Radio: Limited blackout of HF radio communication on main side, less of radio contact for two of stations.</p> <p>Other systems: Degradation of low-frequency navigation signals for two of stations.</p>	<p>S12 (Ch10<sup>10</sup>)</p>	<p>150 per cycle (150 days per cycle)</p>
R1	<p><b>Minor</b></p> <p>HF Radio: Weak or minor degradation of HF radio communication on main side, occasional loss of radio contact.</p> <p>Other systems: Degradation of low-frequency navigation signals for brief periods.</p>	<p>M1 (Ch10<sup>10</sup>)</p>	<p>5000 per cycle (5000 days per cycle)</p>
<p><sup>a</sup> For less than 1 storm per year. For a particular year, see the NOAA Space Weather Scales website.</p> <p><sup>b</sup> For the storm, based on the Kp index, see the NOAA Space Weather Scales website.</p> <p><sup>c</sup> Other frequencies may also be affected by these conditions.</p>			



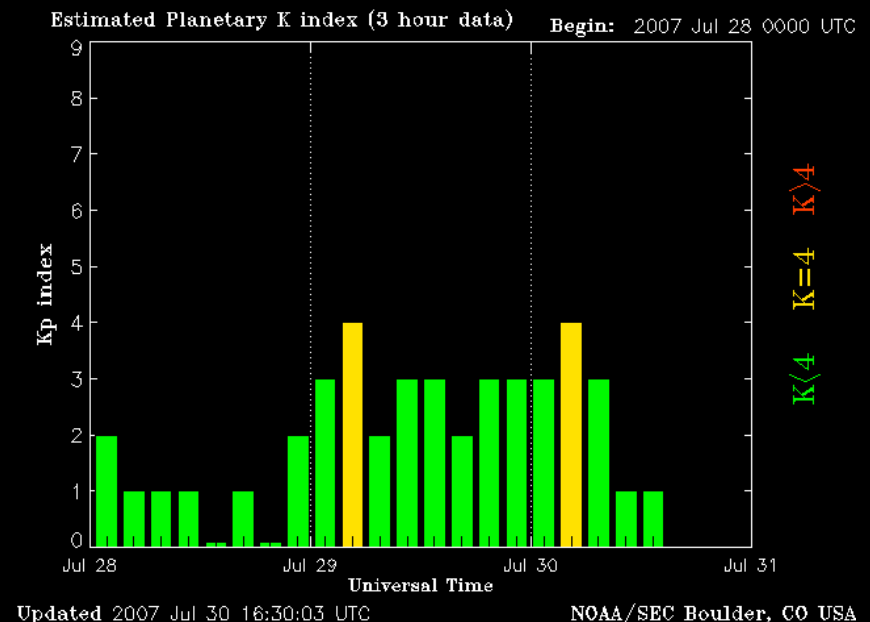
- NOAA G-Scale based on Kp estimates from the Boulder-NOAA Magnetometer
- Warnings issued when Kp values of 4, 5, 6, and 7 or greater are expected
- Alerts issued for Kp values of 4, 5, 6, 7, 8, and 9

# NOAA G-Scale

Category		Effect	Physical measure	Average Frequency (1 cycle = 11 years)
Scale	Descriptor	Duration of event will influence severity of effects		
<b>Geomagnetic Storms</b>			Kp values* determined every 3 hours	Number of storm events when Kp level was met; (number of storm days)
<b>G 5</b>	Extreme	<p><u>Power systems:</u> widespread voltage control problems and protective system problems can occur, some grid systems may experience complete collapse or blackouts. Transformers may experience damage.</p> <p><u>Spacecraft operations:</u> may experience extensive surface charging, problems with orientation, uplink/downlink and tracking satellites.</p> <p><u>Other systems:</u> pipeline currents can reach hundreds of amps, HF (high frequency) radio propagation may be impossible in many areas for one to two days, satellite navigation may be degraded for days, low-frequency radio navigation can be out for hours, and aurora has been seen as low as Florida and southern Texas (typically 40° geomagnetic lat.)**.</p>	Kp=9	4 per cycle (4 days per cycle)
<b>G 4</b>	Severe	<p><u>Power systems:</u> possible widespread voltage control problems and some protective systems will mistakenly trip out key assets from the grid.</p> <p><u>Spacecraft operations:</u> may experience surface charging and tracking problems, corrections may be needed for orientation problems.</p> <p><u>Other systems:</u> induced pipeline currents affect preventive measures, HF radio propagation sporadic, satellite navigation degraded for hours, low-frequency radio navigation disrupted, and aurora has been seen as low as Alabama and northern California (typically 45° geomagnetic lat.)**.</p>	Kp=8, including a 9-	100 per cycle (60 days per cycle)
<b>G 3</b>	Strong	<p><u>Power systems:</u> voltage corrections may be required, false alarms triggered on some protection devices.</p> <p><u>Spacecraft operations:</u> surface charging may occur on satellite components, drag may increase on low-Earth-orbit satellites, and corrections may be needed for orientation problems.</p> <p><u>Other systems:</u> intermittent satellite navigation and low-frequency radio navigation problems may occur, HF radio may be intermittent, and aurora has been seen as low as Illinois and Oregon (typically 50° geomagnetic lat.)**.</p>	Kp=7	200 per cycle (130 days per cycle)
<b>G 2</b>	Moderate	<p><u>Power systems:</u> high-latitude power systems may experience voltage alarms, long-duration storms may cause transformer damage.</p> <p><u>Spacecraft operations:</u> corrective actions to orientation may be required by ground control; possible changes in drag affect orbit predictions.</p> <p><u>Other systems:</u> HF radio propagation can fade at higher latitudes, and aurora has been seen as low as New York and Idaho (typically 55° geomagnetic lat.)**.</p>	Kp=6	600 per cycle (360 days per cycle)
<b>G 1</b>	Minor	<p><u>Power systems:</u> weak power grid fluctuations can occur.</p> <p><u>Spacecraft operations:</u> minor impact on satellite operations possible.</p> <p><u>Other systems:</u> migratory animals are affected at this and higher levels; aurora is commonly visible at high latitudes (northern Michigan and Maine)**.</p>	Kp=5	1700 per cycle (900 days per cycle)

# USAF Estimated Kp

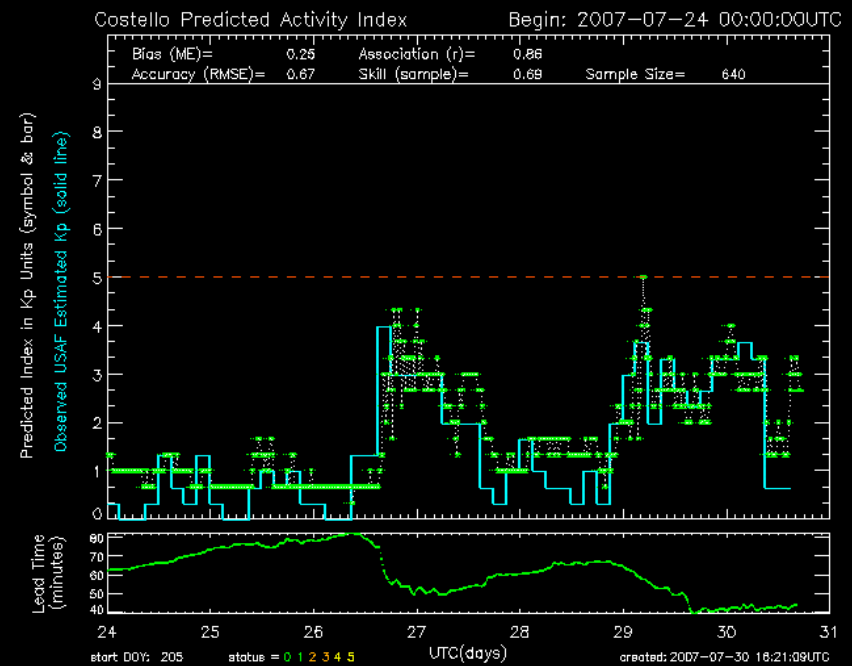
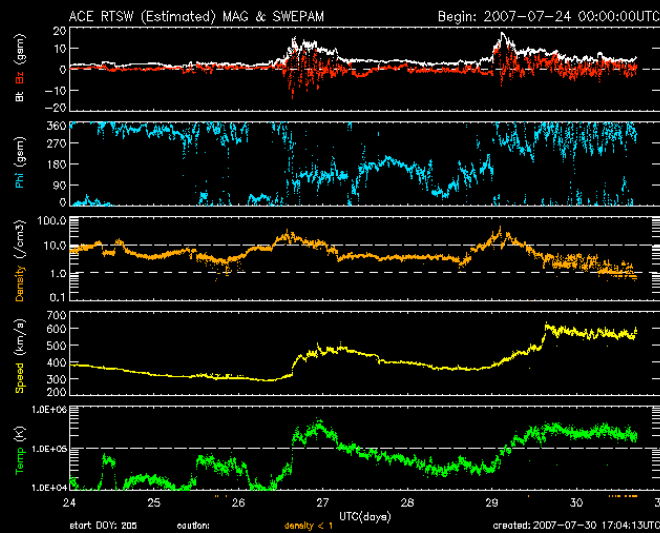
- Official Kp index published with significant time delay
- “Nowcast” Kp algorithm provides real-time estimates of Kp
- Derived using data from 9 ground-based magnetometers in North America
- Calculated by the United States Air Force 55th Space Weather Squadron





# Costello Geomagnetic Activity Index

- Neural network algorithm trained on the response of Kp to solar wind data
- Input two hours of data for solar wind speed, IMF magnitude, and Bz
- Output running 3-hour Kp every 15 minutes

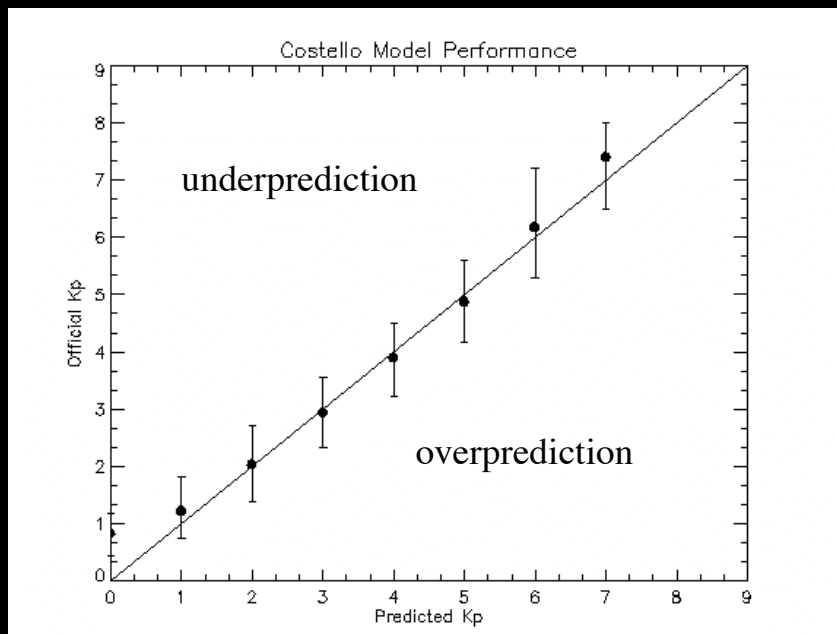


# Motivation for Research

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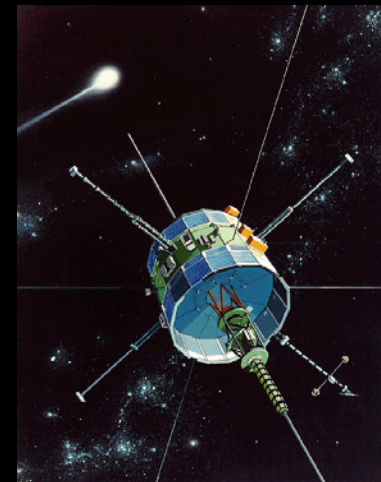
- Space weather forecasters need to know how reliable prediction models are
- Several validation studies have been done on the Costello model
  - Results are not complimentary
  - Important to determine the reasons for discrepancies

# Costello Validation Study 1



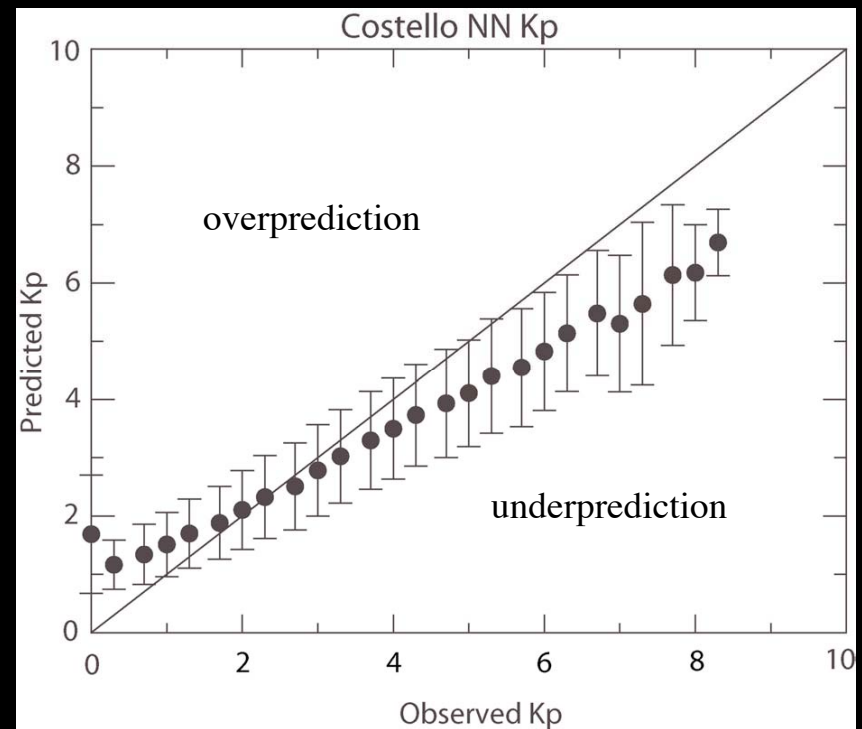
Study performed by members of the Space Environment Center.

- Covers the time period from August 17, 1978 to February 16, 1980 (ISEE-3)
- Predictions binned to integer values between 0 and 7
- Tends to underpredict high and low Kp values



# Costello Validation Study 2

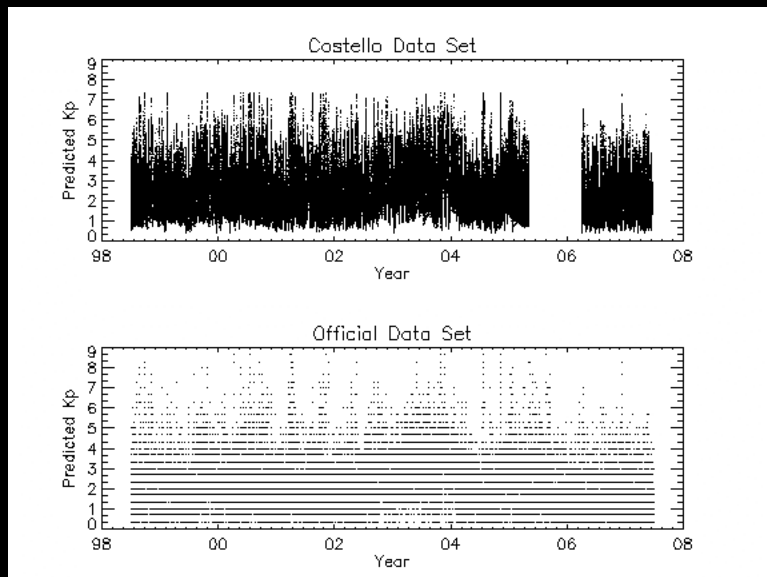
- Covers the time period from 1975-2001 (IMP-8, Wind, ACE)
- Official Kp values obtained by interpolating between points to match 15 minute time granularity
- Tends to overpredict low Kp values and underpredict high Kp values
- Correlation coefficient = 0.75



Study performed by Wing et al.

# Research

- Find the distribution of official Kp values for a given prediction
- Determine if the models perform differently during solar maximum years than during solar minimum years
- Compare the performance of the Costello model to the JHU/APL models



## ■ Data Set

- Supplied Costello prediction data spans from July 1, 1998 until June 18, 2007
- Data gap from May 7, 2005 until April 1, 2006
  - Time granularity of 15 minutes
- Official Kp database is essentially uninterrupted since 1932
  - Time granularity of 3 hours

# Problem

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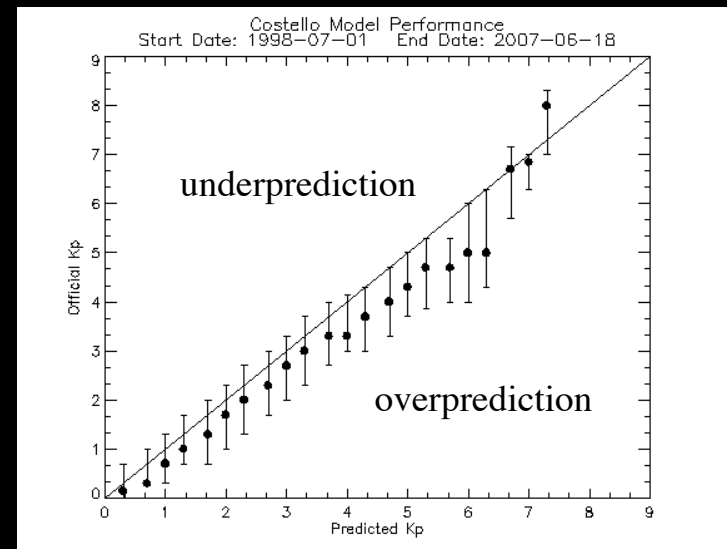
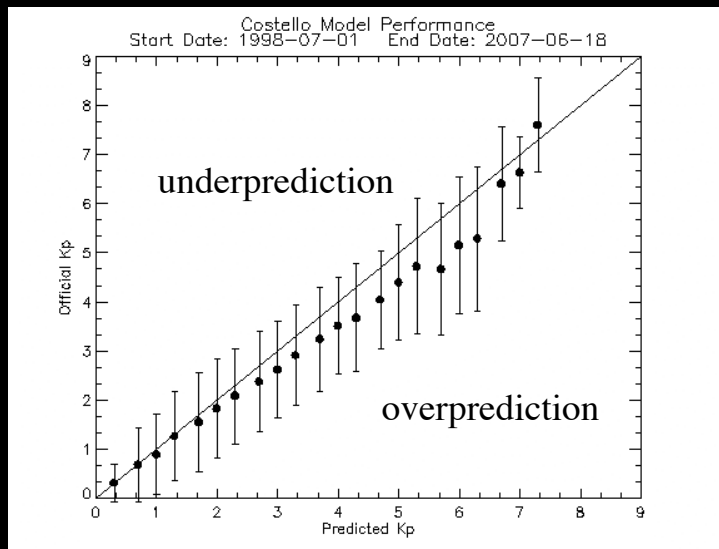
- Time granularity

- Model predictions are made approximately every 15 minutes
- Official Kp values are calculated once every 3 hours

- Solution

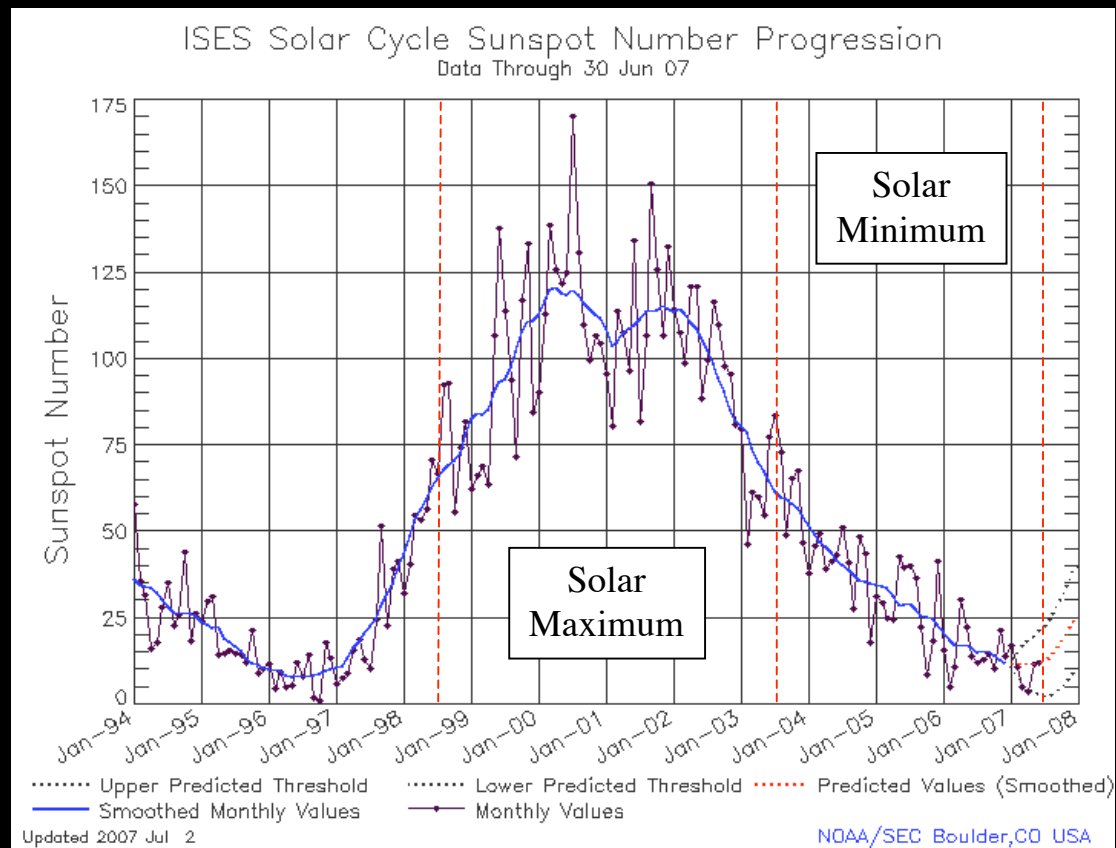
- Time-tag each of the official Kp values at the beginning of the 3 hour interval and find model predictions that are made between 0 and 10 minutes after this time

# Costello Validation



- Kp bins range from 0+ to 7+
- Figure 1: official Kp averages for each bin are plotted with error bars one standard deviation in length
- Figure 2: the median official Kp values for each bin are plotted with error bars showing the upper and lower quartiles

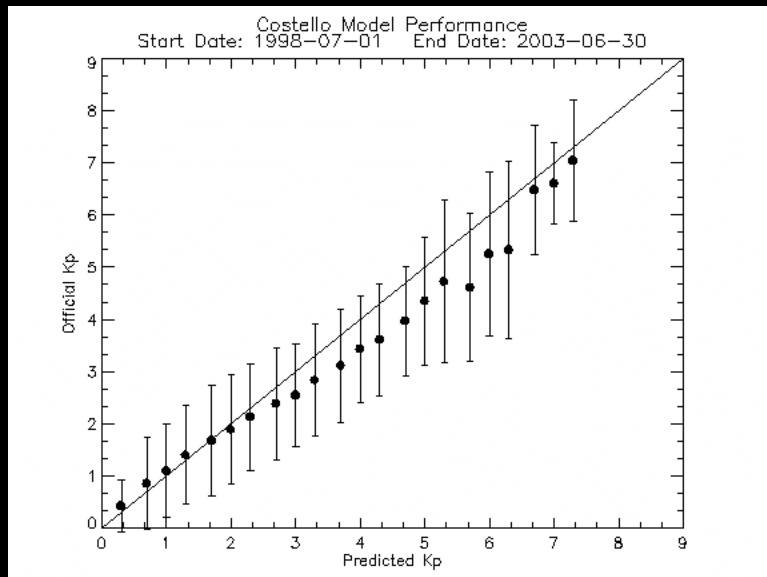
# Solar Cycle Dependence



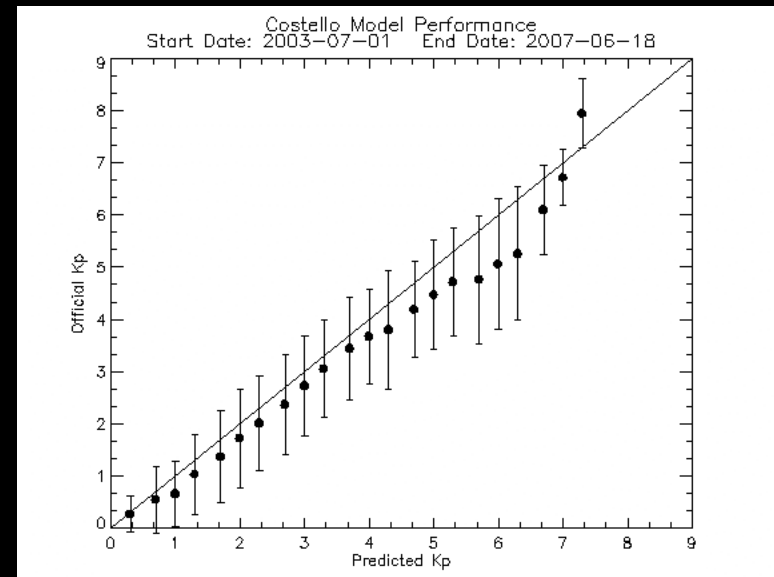
- During solar maximum external influences dominate activity in the magnetosphere
- During solar minimum internal dynamics are responsible for fluctuations in magnetic field strength



# Solar Cycle Dependence (Cont.)



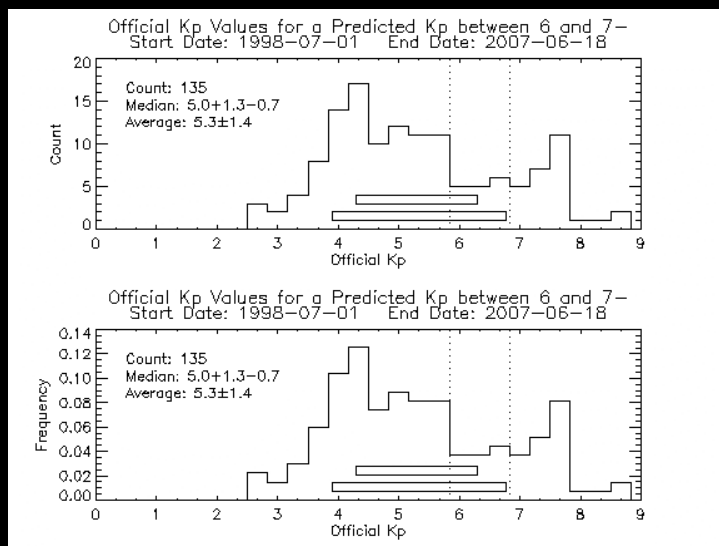
Solar Maximum



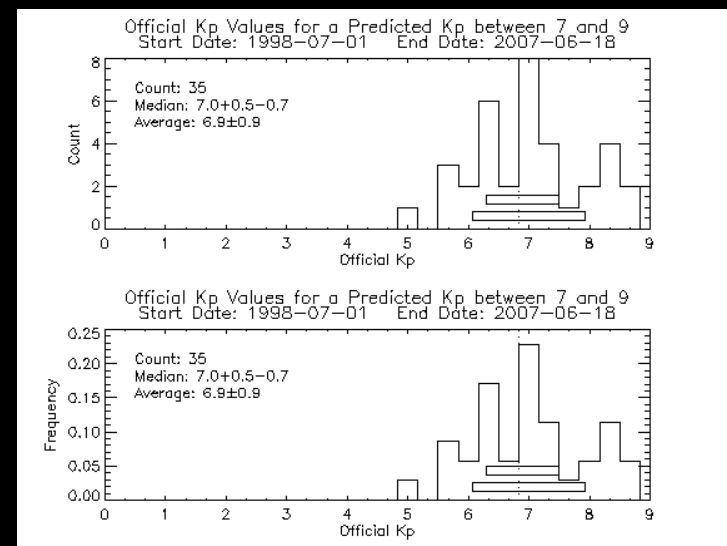
Solar Minimum

- Costello model appears to predict low Kp values slightly better during solar maximum years

# Forecast Specific Validation



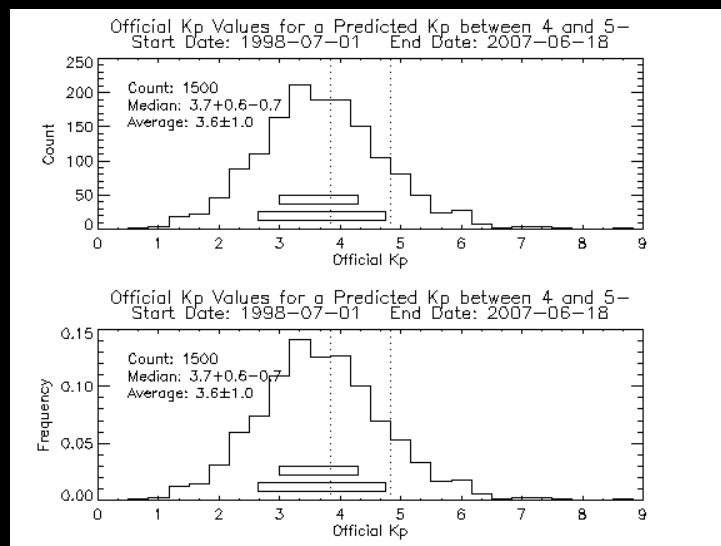
Expected Kp of 6  
(G2 storm)



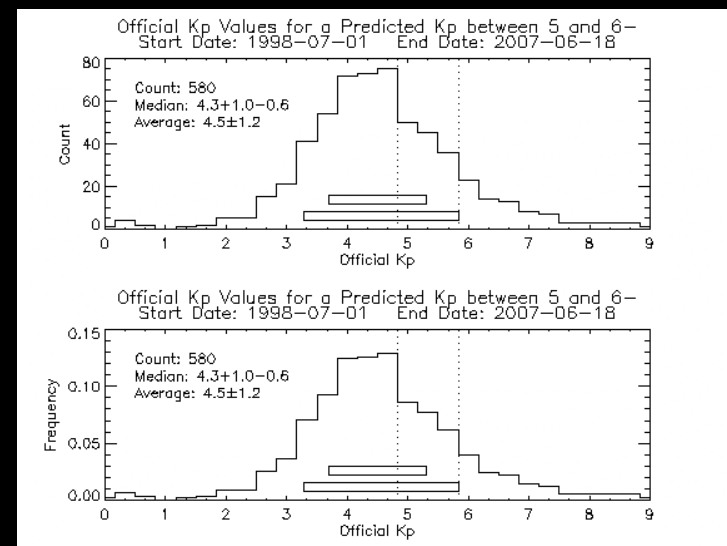
Expected Kp of 7 or greater  
(G3 or higher storm)

- Figures show the distribution of official Kp values for Costello predictions corresponding to NOAA warnings

# Forecast Specific Validation (Cont.)



Expected Kp of 4

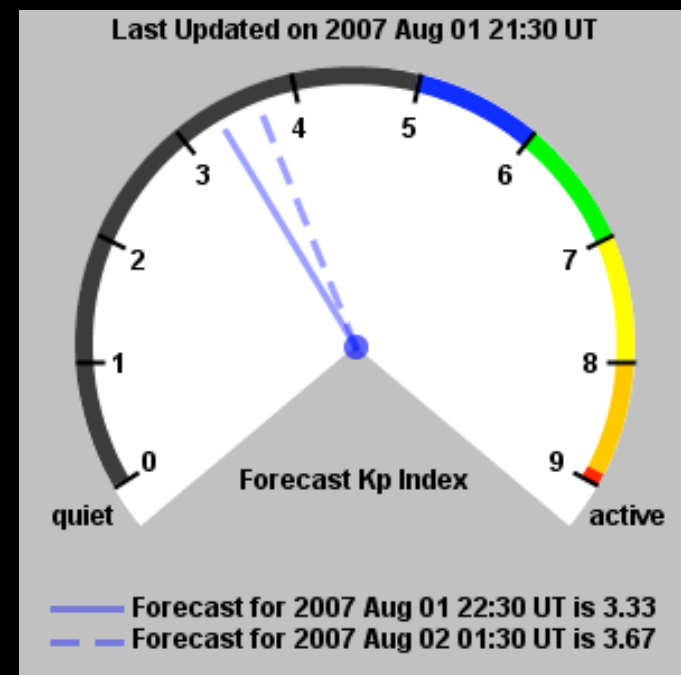


Expected Kp of 5  
(G1 storm)

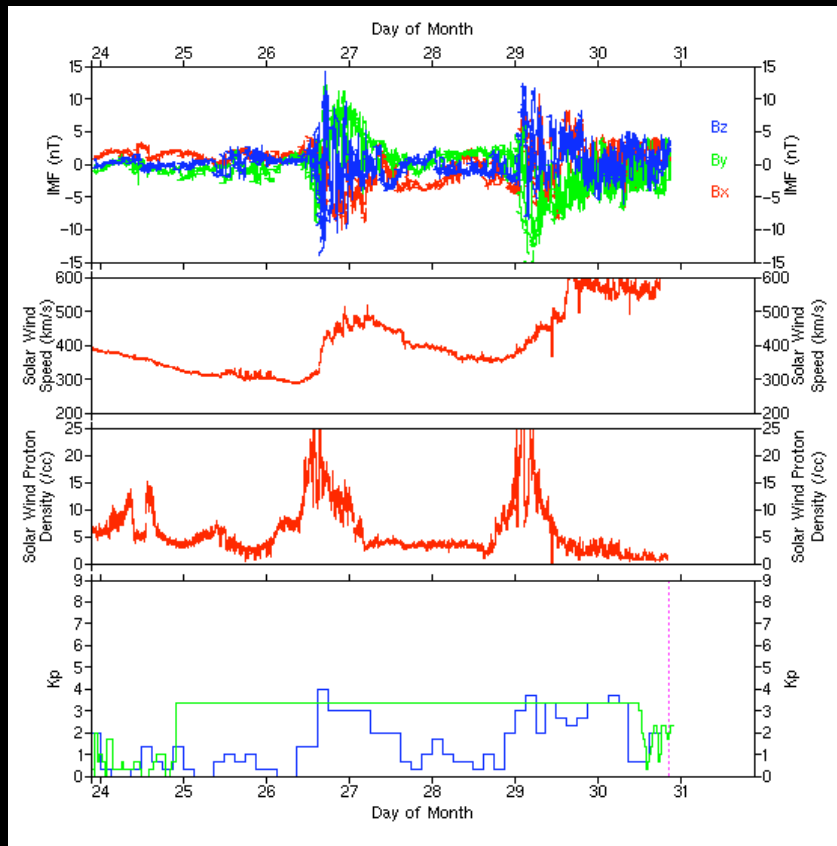
- Figures show the distribution of official Kp values for Costello predictions corresponding to NOAA warnings

# JHU/APL Models

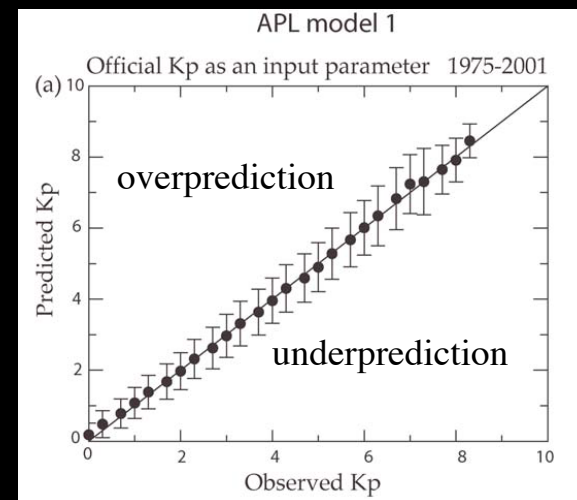
- APL Model 1
  - Inputs nowcast Kp and solar wind parameters
  - Predicts Kp 1 hour ahead
- APL Model 2
  - Same inputs as APL Model 1
  - Predicts Kp 4 hours ahead
- APL Model 3
  - Inputs solar wind parameters
  - Predicts Kp 1 hour ahead



# APL Model 1

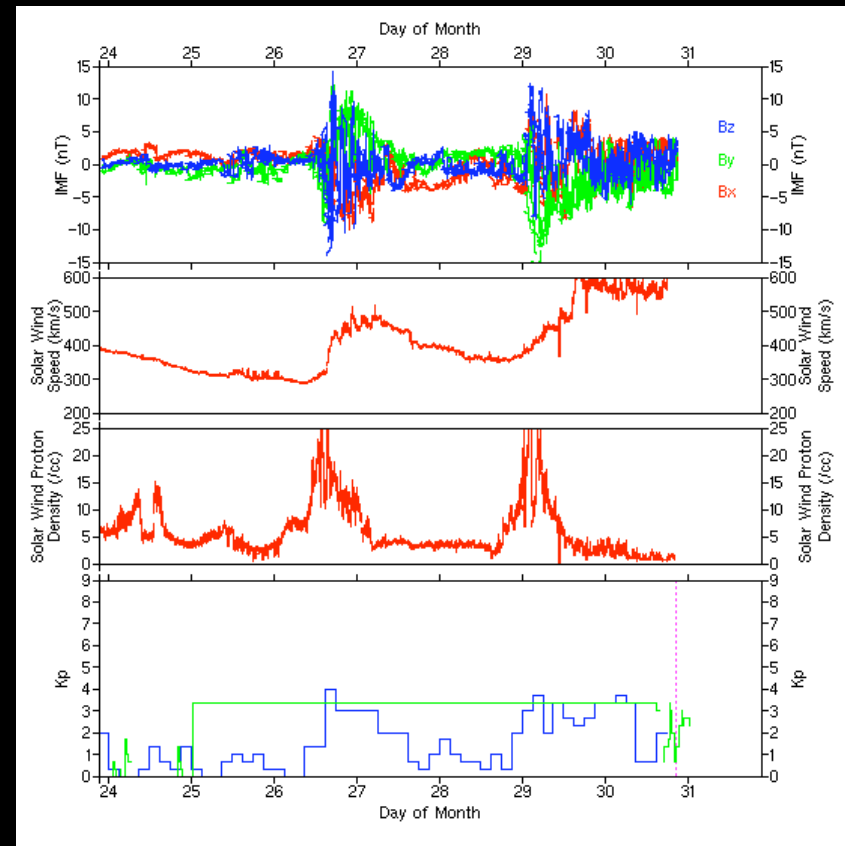
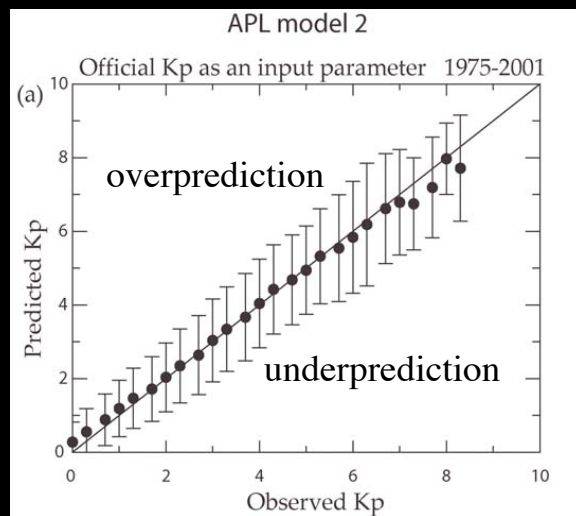


- Inputs nowcast Kp and solar wind parameters
- Predicts Kp 1 hour ahead
- Correlation coefficient = 0.92

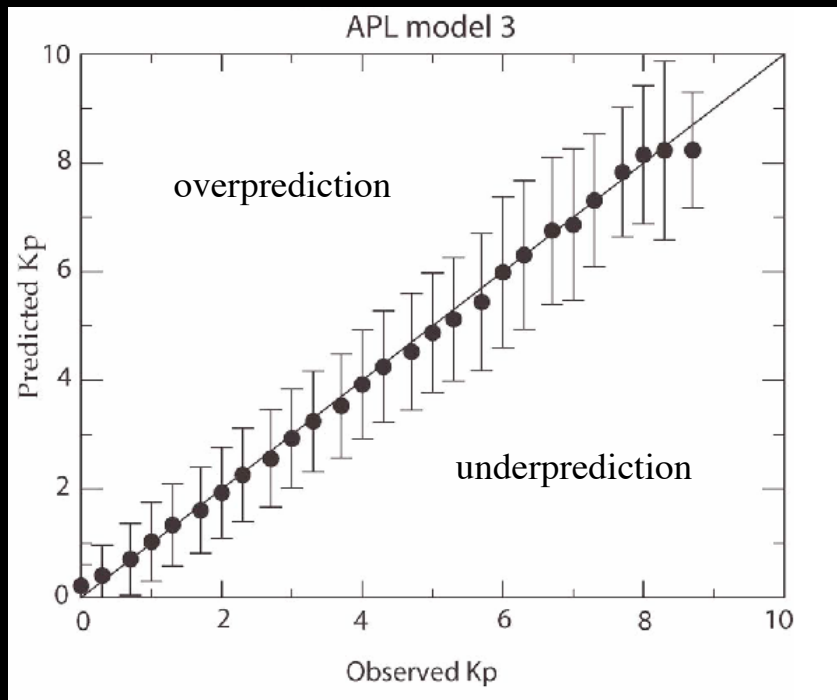


# APL Model 2

- Inputs nowcast Kp and solar wind parameters
- Predicts Kp 4 hours ahead
- Correlation coefficient = 0.79

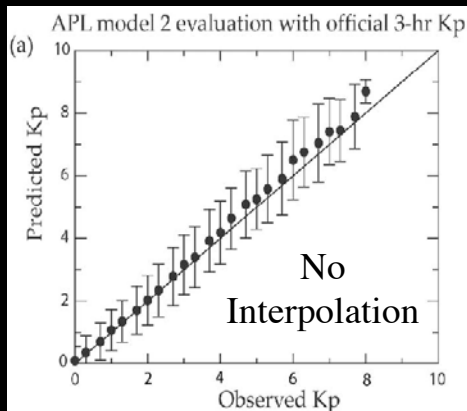
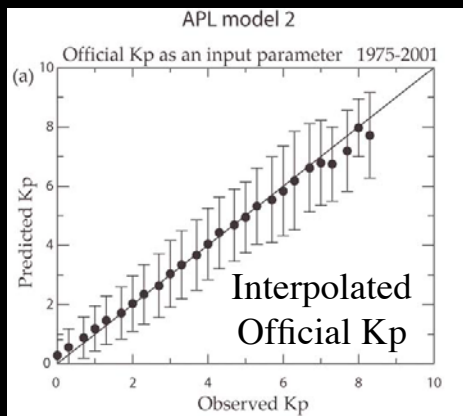


# APL Model 3

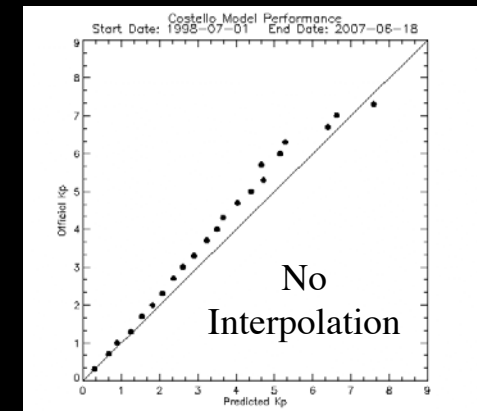
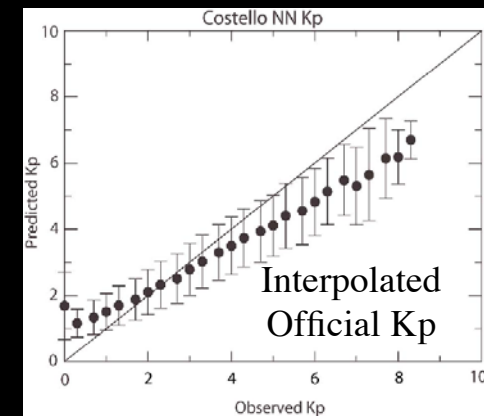


- Inputs solar wind parameters
- Predicts Kp 1 hour ahead
- Correlation coefficient = 0.84

# Resolution to Discrepancy?



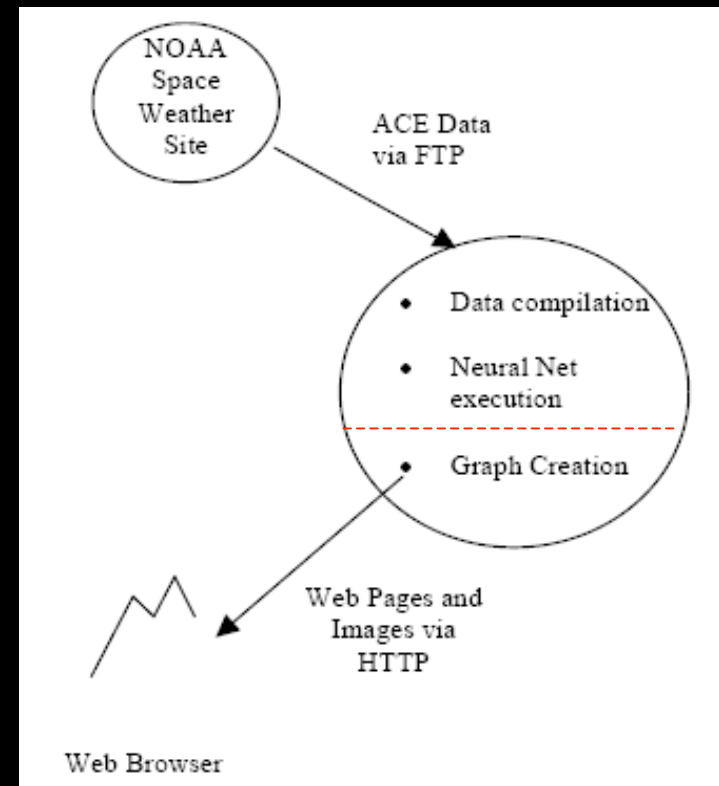
- Interpolation of official Kp values may lead to skew in Wing's validations
- When no interpolation is used, APL model tends to overpredict Kp instead of underpredicting
- Similar skew may be responsible for discrepancy in Costello validations





# APL Model Validations

- APL models installed
- Code edited to run on a NOAA/SEC computer
- Models successfully produce real-time Kp estimates
- Real-time data plots were not produced
- Modifications to run models off of historical data were not completed



# Summary

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- We found that the Costello model tends to overpredict Kp consistently
- Model performance may exhibit some solar cycle dependency
  - Statistical evaluations will have to be performed in order to determine the extent of this dependency
  - Differences in performance are likely irrelevant for forecasting purposes
- Directly comparable validation studies should be carried out to determine if the JHU/APL models perform significantly better than the Costello model
  - Time interval, time granularity, and data set used should be identical



# References

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