### Metrics for Addressing Space Weather Prediction Center User Needs

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### Outline:

- SWPC Customers and SWPC Mission
- Intro to Metrics & Previous Metrics Work
- Example: Geospace Model Selection
- Using Metrics for Model Performance Verification
- SWPC Metrics and Validation Activities
- Conclusions and Lessons Learned

International CCMC-LWS Working Meeting: Assessing Space Weather Understanding and Applications April 3-7, 2017 Cape Canaveral, Florida

### NOAA National Weather Service Space Weather Prediction Center

THE NATION'S OFFICIAL SOURCE OF SPACE WEATHER ALERTS AND WARNINGS

Acknowledgments: Balch, Cash, Murtagh, Onsager, Rutledge, Steenburgh, Viereck

## Customer Subscriptions Skyrocket... (through February 2017)



Small solar cycle, but the largest geomagnetic storms on record occurred during smaller than average cycles (e.g. 1859, 1921)

# **Space Weather Prediction Center**

**Established 1946 as part of Central Radio Propagation Laboratory** 

#### **Operations – Space Weather Forecast Office**



#### Daily forecast since 1965.

Specifications; Current conditions Forecast; Conditions tomorrow Watches; Conditions are favorable for storm Warnings; Storm is imminent with high probability Alerts; observed conditions meeting or exceeding storm thresholds

#### R & D –

**R20** 

#### Space Weather Prediction Testbed Transitioning models into operations

#### Research-to-Operations

Applied Research

#### Model Development

- Model Test/Evaluation
- Model Transition
- Operations Support

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#### **Operations-to-Research**

- Customer Requirements
- Observation Requirements
- Research Requirements



# **A Metrics Definition**

" A METRIC IS A MEASUREMENT, TAKEN OVER TIME, THAT COMMUNICATES VITAL INFORMATION ABOUT A PROCESS OR ACTIVITY, DRIVES APPROPRIATE LEADERSHIP OR MANAGEMENT ACTION, AND IS LINKED TO THE STRATEGIC PLANNING PROCESS."

From: Performance Measurement And Management - Modern Techniques by Capt Harry Krukenberg - Air Force Institute of Technology

# Metrics Definition (with Possible Example)

"A METRIC (Geopace model skill predicting dB/dt) IS A MEASUREMENT, TAKEN OVER TIME, THAT **COMMUNICATES VITAL INFORMATION (poor** comparison of model dB/dt thresholds with nightside observations) ABOUT A PROCESS OR **ACTIVITY (substorm activity), DRIVES APPROPRIATE LEADERSHIP OR MANAGEMENT ACTION** (support model development that includes ionospheric outflow), AND IS LINKED TO THE STRATEGIC PLANNING PROCESS (e.g. National Space Weather Strategy; Ops Center investment)."

# **Prior Community Work on Metrics**

### ESTABLISHING METRICS FOR THE NATIONAL SPACE WEATHER PROGRAM: A Strategy, Implementation Plan, and Metrics Guidelines (1998)

Identifies both scientific and operational metrics

| Steering Committee<br>E. Szuszczewicz* (Chair): Ionospheric-Thermospheric<br>E. Hildner*: Solar-Interplanetary (Solar Wind)<br>R. Wolf*: Magnetospheric-Ionospheric |                                |                           |  |  |  |  |  |
|---|--------------------------------|---------------------------|--|--|--|--|--|
|   | Subpanels                      |                           |  |  |  |  |  |
| Solar-Interplanetary  | Magnetospheric-<br>Ionospheric | Ionospheric-Thermospheric |  |  |  |  |  |
| T. Bastien  | J. Albert                      | D. Anderson               |  |  |  |  |  |
| J. Davils   | D.N. Baker                     | S. Basu                   |  |  |  |  |  |
| S. Habbal   | W. Burke*                      | W. Denig                  |  |  |  |  |  |
| J. Harvey   | J. L. Horwitz                  | D. Farley                 |  |  |  |  |  |
| T. Hocksema   | J. Lyon*                       | B. Fejer*                 |  |  |  |  |  |
| S. Kahler   | T. Onsager                     | T. Fuller-Rowell*         |  |  |  |  |  |
| J. Klimchuk*  | J. Raeder                      | R. Heelis*                |  |  |  |  |  |
| J. Lean   | J. Rochier                     | T. Killeen*               |  |  |  |  |  |
| J. Linker*  | H. Singer*                     | F. Marcos                 |  |  |  |  |  |
| D. Neidig*  | T. Tascione*                   | R. Meier                  |  |  |  |  |  |
| V. Pizzo*   | D. Vassiliadis                 | P. Richards               |  |  |  |  |  |
|   |                                | R. Schunk                 |  |  |  |  |  |

\*Initial panel membership responsible for generating strawman specifications for NSWP metrics.

# Prior Community Work on Metrics

Center for Integrated Space Weather Modeling Metrics Plan and Initial Model Validation Results

H. Spence et al. / Journal of Atmospheric and Solar-Terrestrial Physics 66 (2004) 1499–1507

| C         | Opera<br>1 | ational SW Community<br>Shocks and CMEs at L1  | Baseline Models  | Data Sets                  | Models                        |
|-----------|------------|--|--|----------------------------|-------------------------------|
| C         | Dpera<br>1 | ational SW Community<br>Shocks and CMEs at L1  |  |                            |                               |
|           | 1          | Shocks and CMEs at L1  |  |                            |                               |
|           |            | a Speed  | Augmented Vrsnack-<br>Gopalswamy <sup>a</sup>                    | ACE<br>"                   | MAS+ENLIL                     |
|           |            | b Arrival time<br>c Bz   |  |                            |                               |
| letrics   | 2          | a Event/No Event<br>b Rise Time  | PROTONS <sup>®</sup>   | GOES<br>"                  | UCB                           |
| ational N | 3          | c Peak Flux<br>d Duration<br>e Cutoff  | "<br>"<br>Shea-Smart°  | "<br>"<br>POES             |                               |
| Opera     | 5          | a Dst<br>b Ap/K  | Temerin-Li <sup>d</sup><br>ARX-McPherron                         | NGDC<br>"                  | LFM+RCM                       |
|           | 4          | Regional Ground dB/dt  | Weigel-Baker*  | IMAGE (mag)                | LFM+TING                      |
|           | 5          | Radiation Belt EP fluxes<br>a GEO<br>b MEO and LEO   | Li <sup>f</sup><br>Vassiliadis <sup>e</sup>                      | LANL                       | RBM                           |
|           | 6          | Ionosphere/Neutral Atmosphere<br>a "State" of ionosphere   | IRI <sup>h</sup>   | Digisondes                 | TING                          |
| S         | Scier      | ntific SW Community  |  |                            |                               |
|           | 1          | Solar/Coronal  |  |                            |                               |
|           | 2          | a Coronal Hole Index<br>b White-light Streamer Belt Index<br>Solar Wind/IME at L1                              | PFSS/Wang-Sheeley <sup>i</sup><br>PFSS/Yi-Ming Wang <sup>j</sup> | SOHO UV maps<br>SOHO LASCO | MAS+ENLIL<br>"                |
|           | -          | a Density<br>b Velocity<br>c IMF - vector  | WSA <sup>k</sup> + nv = constant<br>WSA<br>WSA + IBI             | ACE<br>"                   | MAS+ENLIL<br>"                |
| e Metrico | 3          | GEO/MEO Environment<br>a Magnetic field<br>b Particle fluxes (ring current/rad belt)                           | Tsyganenko <sup>1</sup>  | GOES                       | LFM+RCM                       |
| Science   | 4          | c M'pause crossing<br>MI Coupling  | Shue °   | GUES/LANL<br>"             | LFM+RCM                       |
|           |            | <ul> <li>a Polar Cap Potential</li> <li>b Polar Cap Boundary</li> <li>c Field Aligned Currents (2D)</li> </ul> | Weimer<br>Weimer<br>Weimer                                       | UMSP<br>"                  | LFM+1ING<br>"<br>LFM+TING+MIC |
|           | _          | d Particle precipitation   | AURORA 9   | ee                         | MIC                           |
|           | 5          | a E-, F-region Heights   | IRI  | Digisondes +               | TING                          |

# Geospace Models: Transition to Operations

- **Goal:** Evaluate Geospace models (MHD and empirical) to determine which model(s) are ready for transition to operations
- Focus: Regional K and dB/dt (important to electric utilities)
- Partnership: Evaluation at NASA/Goddard CCMC working with SWPC, modelers and science community



SWPC Selection FY 14: U. Of Michigan (MHD), VT (Weimer Empirical)

based on CCMC reports, internal and external advice, and following considerations:



Solar Influences on Geospace Predicted with Geospace Models using Solar Wind Input

- Strategic Importance
- Operational Significance
- Implementation Readiness
- Cost to Operate, Maintain, and Improve

U. Of Michigan Geospace Model Operational Oct 16

## Geospace Model Selection Threshold Metric dB/dt Model Data Comparisons at High Latitudes

Contingency tables can be created from model/ observation values crossing thresholds at different dB/dt levels.

Pulkkinen et al.: Geospace Model Validation/Transition, Space Weather Journal, 2013.





Dec 14, 2006 12 UT Dec 16, 2006 00 UT Black – Model Blue - Observation

### Geospace Model Selection Model Data Comparisons POD and POFD for different dB/dt Thresholds integrated over high and mid-latitude stations

Pulkkinen et al.: Geospace Model Validation/Transition, Space Weather Journal, 2013.

> Blue – POD Black – POFD





## Geospace Model Selection Distribution Metric Distribution of model K for Observed K=4, 5, and 6 at mid-latitude stations



- Illustrates biases
- Insight into skill scores in contingency tables
- Identifies
   systematic
   and random
   errors

Glocer et al.: Geospace Model Validation/Transition, SWJ, 2016.

## Validation and Metrics Applied to Operational Michigan Geospace Model



Kp Distribution of Predicted Kp Values for Observed Kp Values (1-6)

Enhances understanding of model performance

Enables establishment of confidence levels and error bars

# **SWPC Metrics and Validation**

- www.swpc.gov (under Products and Data, Reports, Forecast Verification)
- Topics include:
  - Geomagnetic Activity
     Forecasts
  - Solar Activity Forecasts
  - Flare Receiver Operating Characteristics (ROC) Curves
  - Bibliography, Tutorials, Verification Glossary



# Receiver Operation Characteristic Curves Applied to Flares and SPE

|          |       | Observed |     |       |  |
|----------|-------|----------|-----|-------|--|
| Forecast |       | Yes      | No  | Total |  |
|          | Yes   | а        | b   | a+b   |  |
|          | No    | С        | d   | c+d   |  |
|          | Total | a+c      | b+d | n     |  |





See SWPC http://www.swpc.noaa.gov/content/ roc-receiver-operating-characteristic-curves

# Metrics: Selected Lessons Learned and Conclusions

- Metrics for model performance are different from metrics for operational forecasts (forecasters provide forecasts; models provide guidance)
- The same product (model prediction) may need different metrics applied for different users
  - E.g. power grid (Kp 5) vs pigeon racer (Kp 4)
- Operational metrics can be different than scientific metrics
  - dB/dt on ground vs cross-polar cap potential
- Sometimes operations can benefit by using scientific rather than operational metrics
  - Bz accuracy is a scientific metric, but clear that many operational products can benefit from Bz accuracy

# Metrics: Selected Lessons Learned and Conclusions

- Operational metrics can be established by customers and forecasters, but iteration between customers and model developers leads to appropriate choices
- One model may not always be "best" at all metrics
- Metrics are important for understanding model limitations and credibility
- Evaluations for operations (rather than science) provides valuable feedback to science (O2R)
- Models depend on data for input, assimilation, and validation