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# Solar Activity and Space Weather KASI's Ongoing Studies to Understand and Predict Solar Flares

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#### 1. Introduction: solar activities and their impacts on space weather







Credit: L. J. Lanzerotti

#### **1. Introduction: solar flares**



#### 1. Introduction: X-ray and EUV emissions from a flare



#### 1. Introduction: EUV spectrum during a flare (Milligan+2012)



SDO/EVE - MEGS-A Spectrum

#### 1. Introduction: ionospheric response to solar flare irradiance



Number density  $(cm^{-3})$ 

### 2. Daily forecasts of flaring activity of the Sun

- Fully automated and operational
  - : Issued daily at 00:00 UT if either NASA's Solar Dynamics Observatory (SDO) near-realtime (NRT) data or NOAA's Solar Region Summary (SRS) is available
- Three forecast windows: 0–24 hr, 24–48 hr and 48–72 hr from the issuance time
- Event definitions: NOAA/GOES C-, M-, and X-class
- Methods: Poisson statistics with
  - 1) dH/dt: transport rate of magnetic helicity via the photospheric surface of active regions
  - 2) McIntosh sunspot classification

### 2. Daily forecasts of flaring activity of the Sun

• **Common challenge**: flares near or partially occulted by the solar limb (Park+2020)



Flare Forecasting Model Evaluation Workshop in 2017

 During the testing interval of 2016 to 2017, there were four M1.0+ event-days (of 26 event-days, or 15%) for which all flare forecasting models failed to provide a "yes" forecast with the probability threshold of 0.5.



 Table 6. Summary for Limb Flares on Four Event-days

Flare			Source Region	
#	Start Time	Peak Flux	NOAA Number	Location
1	2016-01-01 23:10 UT	M2.3	12473	S25 W82
2	2016-08-07 14:37 UT	M1.3	$\operatorname{None}^\dagger$	$S12 W70^{\$}$
3	2017-07-03 15:37 UT	M1.3	$\operatorname{None}^\dagger$	N02 W85
4	2017-10-20 23:10 UT	M1.1	12685	$\rm S12~E88^{\$}$

### 2. Daily forecasts of flaring activity of the Sun

1000

500

-1000

- Under way to update the forecasting methods with differential emission measure (DEM; n<sub>e</sub><sup>2</sup> along the line-of-sight for a given temperature range) from solar full-disk EUV NRT images obtained by the Atmospheric Imaging Assembly (AIA) onboard SDO.
  - : DEM maps derived from AIA NRT data using the regularized inversion by Hannah & Kontar (2012, 2013)
  - : For example, M1.2 flare in AR13413 (with an S1 proton flux) → start 02:54 UT / peak 04:47 UT
  - : Enhancement of DEM (particularly, T  $\gtrsim$  10 MK) right before and around the GOES flare start time
  - : Reasonable calculation time (typically, a few min) of DEM for all AR pixels of a solar full-disk image
  - : Under investigation with various flare events





Differential Emission Measure (DEM) at  $T_{OBS} = 2023-09-01$  02:45 TAI

### 3. Deep learning model for solar flare irradiance translation: motivation

- Crucial to have EUV spectral irradiance measurements of solar flares
  - Solar plasma diagnostics  $\rightarrow$  understanding of energy release, coronal heating, ...
  - Modeling the ionospheric response to flares  $\rightarrow$  space weather applications (forecast)
- Limited with a small number of solar EUV spectrometers operated in space so far (e.g., SDO/EVE since 2010): mission lifetime, wavelength range, ...
- NOAA's GOES/X-ray Sensor (XRS) measurements of soft X-ray irradiance since 1975
  - Two channels: 0.05–0.4 nm (short), 0.1–0.8 nm (long)
  - Cadence: 2 or 3 sec



### 3. DL model for solar flare irradiance translation: goal

- Developing a deep learning (DL) model that can generate irradiance in EUV channels from GOES soft X-ray irradiance measurements of a given flare
  - : **Solar flare irradiance translator** (SFIT, soft X-ray  $\rightarrow$  EUV)
- Applications of the developed model
  - A statistical studies of solar flares: EUV properties, plasma temperatures/densities
  - A case study of an ionospheric response to EUV irradiance during a flare event (e.g., comparing ionosphere models with/without flare EUV input)

### 3. DL model for solar flare irradiance translation: dataset

#### Event definition

 A total of 1,993 flare events larger than the GOES C2.0 peak flux from the SDO/EVE flare catalog (2010 – 2014)

#### Input data

- GOES/XRS (0.1–0.8 nm channel) 1-min average irradiance time series over 6 hours (±3 hours from the GOES flare peak)
- Output data
  - SDO/EVE/MEGS 1-min average irradiance time series for three flare emission lines (9.4, 13.3, 30.4 nm) among a total of 30
- Preprocessing
  - interpolation for data gaps as well as suspicious points (outliers)



## 3. DL model for solar flare irradiance translation: model

• Fully Connected Layer (FLC) is a sort of Multi-layer Perceptron (MLP) characterized by densely interconnected neurons, where each neuron in the previous layer is connected to every neuron in the next layer.



#### 3. DL model for solar flare irradiance translation: results I. 13.3 nm



#### 3. DL model for solar flare irradiance translation: results II. 9.4 nm



#### 3. DL model for solar flare irradiance translation: results III. 30.4 nm



## Summary and discussion

- Various studies are being carried out at KASI to better understand and predict solar flares, mainly using:
  - 1) large datasets obtained with persistent observations from space such as NASA's SDO and NOAA's GOES
  - 2) recent techniques of data science (such as deep learning)
- One of the key elements for the flare study would be to construct a comprehensive (but fundamental only), consistent and easy-to-use science database from observations and simulations.
- In this context, an international-community-wide effort is required to efficiently design the database and future space (e.g., off-Sun-Earth line) missions such as an L4 mission under the feasibility study by KASI.