



## AI-based approaches to data integration for Solar Orbiter instruments

michele piana

MIDA, dipartimento di matematica, università di genova

OATo, istituto nazionale di astrofisica, torino

*9th metis workshop, january 24-26 2024*

*museo diocesano di catania, catania, italy*

credits

# credits: people

## **solar physics and space weather people @MIDA:**

- anna maria massone
- sabrina guastavino
- federico benvenuto
- emma perracchione (@POLITO)
- francesco marchetti (@UNIPD)
- paolo massa (@FHNW)
- andrea tacchino
- mattia rossi
- katia bahamazava (@POLITO)
- gianluca audone (@POLITO)
- edoardo legnaro
- anna volpara
- barbara palumbo
- fabiana cammattari
- margherita lampani
- miriana catalano

## **external collaborator:**

- daniele telloni (@OATo)
- sam krucker (@FHNW)
- andrea battaglia (@FHNW)
- a gordon emslie (@WKU)
- gordon hurford (@berkeley)
- dario del moro (@tor vergata)

credits: money



ARCAFF  
PI: a m massone



Fondazione  
Compagnia  
di San Paolo

Alxtreme  
PI: a m massone



SWESNET  
subcontract



CORNERSTONE  
PI: f benvenuto



solar orbiter contract



some tentative science

## a tentative and personal list of open issues

### **solar flares:**

- to what (quantitative) extent is it possible to predict whether an AR will produce a flare, and when, and of which class?
- which are the most effective precursors of a solar flare hidden in magnetograms and EUV images?
- which is the (quantitative) effectiveness of the acceleration mechanisms in a solar flare?

### **CMEs:**

- is it possible to automatically detect and track a CME in a coronagraphic image?
- once a CME occurs, how can one accurately and computationally determine its travel time from the sun to L1?
- how is it possible to compute the CME vital parameters in a detailed way using computation?

### **flares and CMEs:**

- how can one distinguish in advance between a CME-triggering flare and a flare with no associated CME?
- are there physically explainable correlations between the parameters of CME-triggering flares and of the corresponding CMEs?

## a tentative and personal general approach

### **ingredient 1: STIX data**

- imaging approach: fourier
- spatial resolution: down to 7 arcsec
- temporal resolution: 1 sec
- spectral resolution: around 3 keV
- energy range: 4-50 keV
- database: 6000 events with at least 1000 counts at low energy

### **ingredient 2: metis data**

(see this workshop)

### **ingredient 3: artificial intelligence:**

- inverse problems approaches for image reconstruction from STIX data
- convolutional neural networks to detect and track CMEs in metis images
- physics-based neural networks to compute CMEs vital parameters
- featured-based machine learning to identify correlations between STIX and metis data

preliminary results: metis

see this workshop



# preliminary results: image reconstruction for STIX

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## MEM\_GE: A New Maximum Entropy Method for X-Ray Vignetting

Paolo Massa<sup>1</sup>, Richard Schwartz<sup>2</sup>, A Kim Tolbert<sup>2</sup>, Anna Maria Massone<sup>3</sup>, Federico Benvenuto<sup>4</sup>

<sup>1</sup>Dipartimento di Matematica, Università di Genova, via Dodecaneso 35  
[benvenuto@dima.unige.it](mailto:benvenuto@dima.unige.it)

<sup>2</sup>NASA Goddard Space Flight Center, Greenbelt (MD), USA; [richard.a.schwartz@nasa.gov](mailto:richard.a.schwartz@nasa.gov)

<sup>3</sup>CNR—SPIN Genova, via Dodecaneso 35

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## Unbiased CLEAN for STIX in Solar Orbiter

Emma Perracchione<sup>1</sup>, Fabiana Camattari<sup>1,2</sup>, Anna Volpara<sup>3</sup>, Paolo Massa<sup>4</sup>, Anna Maria Massone<sup>3</sup>, and Michele Piana<sup>3,5</sup>

<sup>1</sup>Dipartimento di Scienze Matematiche “Giuseppe Luigi Lagrange”, Politecnico di Torino, Corso Duca degli Abruzzi, 24, I-10129, Torino, Italy  
[emma.perracchione@polito.it](mailto:emma.perracchione@polito.it)

<sup>2</sup>Dipartimento di Matematica “Giuseppe Peano”, Università di Torino, Via Carlo Aberto 10, I-10123, Torino, Italy

<sup>3</sup>MIDA, Dipartimento di Matematica, Università di Genova, via Dodecaneso 35, I-16145 Genova, Italy

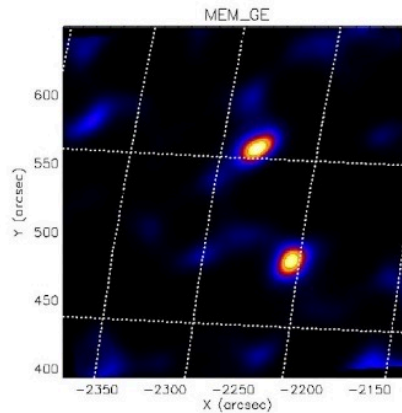
<sup>4</sup>Department of Physics and Astronomy, Western Kentucky University, Bowling Green, KY 42101, USA

<sup>5</sup>Istituto Nazionale di Astrofisica, Osservatorio Astrofisico di Torino, Pino Torinese, Italy

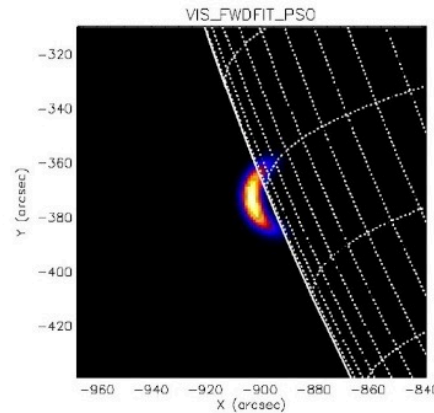
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## Forward fitting

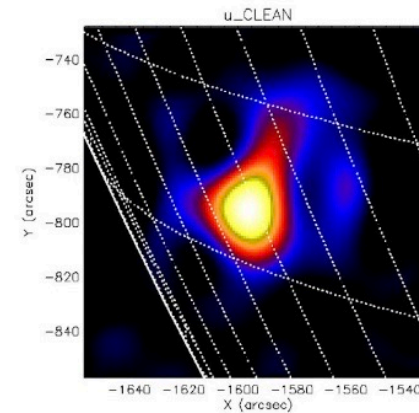
Anna Volpara<sup>1</sup>, Paolo Massa<sup>2</sup>, Emma Perracchione<sup>1</sup>, Federico Benvenuto<sup>1</sup>, Säm Krucker<sup>5,7</sup>, Michele Piana<sup>3,5</sup>



constrained  
maximum  
entropy



particle  
swarm  
optimization



automated  
CLEAN

# preliminary results: flare forecasting



## Machine Learning as a Flaring Storm Warning Machine: Was a Warning Machine for the 2017 September Solar Flaring Storm Possible?

F. Benvenuto<sup>1</sup>, C. Campi<sup>1</sup>, A. M. Massone<sup>2</sup>, and M. Piana<sup>2</sup>

<sup>1</sup>Dipartimento di Matematica, Università di Genova, Genova, Italy; [benvenuto@dima.unige.it](mailto:benvenuto@dima.unige.it), [campi@dima.unige.it](mailto:campi@dima.unige.it)

<sup>2</sup>Dipartimento di Matematica, Università di Genova and CNR—SPIN, Genova, Italy; [massone@dima.unige.it](mailto:massone@dima.unige.it), [piana@dima.unige.it](mailto:piana@dima.unige.it)

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## Operational solar flare forecasting via video-based deep learning

Sabrina Guastavino<sup>1\*</sup>, Francesco Marchetti<sup>2</sup>,  
Federico Benvenuto<sup>1</sup>, Cristina Campi<sup>1</sup> and Michele Piana<sup>1,3</sup>

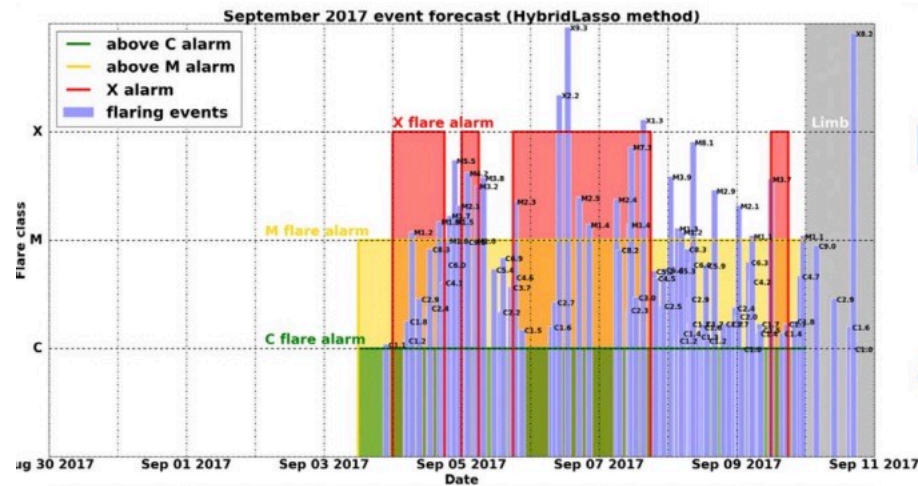
<sup>1</sup>MIDA, Dipartimento di Matematica, Università di Genova, Genova, Italy, <sup>2</sup>Dipartimento di Matematica "Tullio Levi Civita", Università di Padova, Padova, Italy, <sup>3</sup>INAF—Osservatorio Astrofisico di Torino, Torino, Italy

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EDITED BY  
Enrico Camporeale,  
University of Colorado Boulder, United States

REVIEWED BY  
Alexey A. Kuznetsov,  
Institute of Solar-Terrestrial Physics (RAS),  
Russia  
P. Vemareddy,  
Indian Institute of Astrophysics, India



# preliminary results: travel time prediction for CMEs

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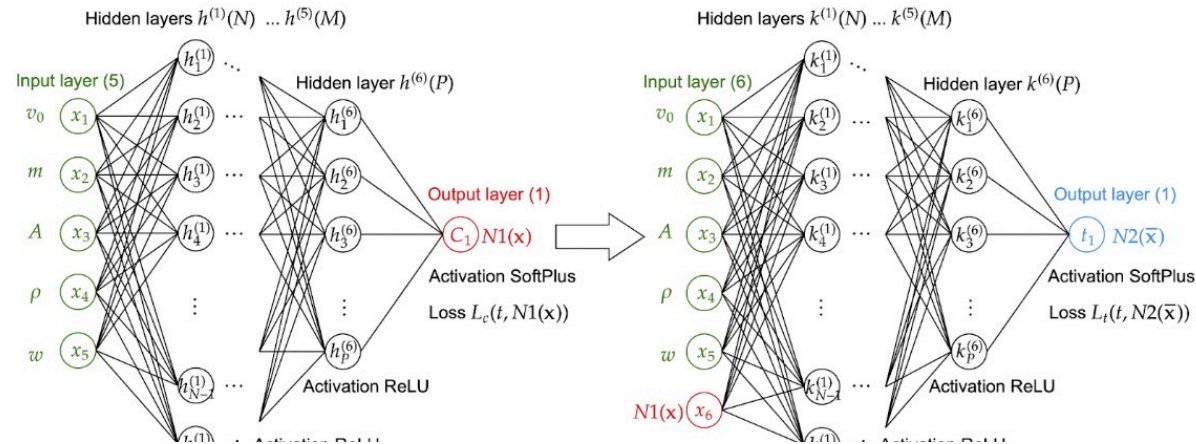
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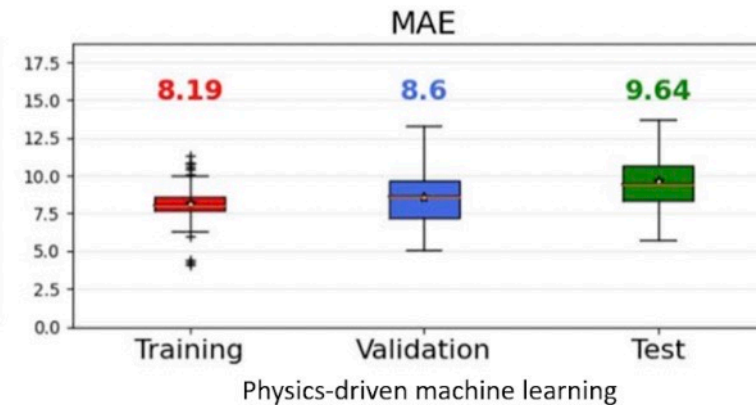
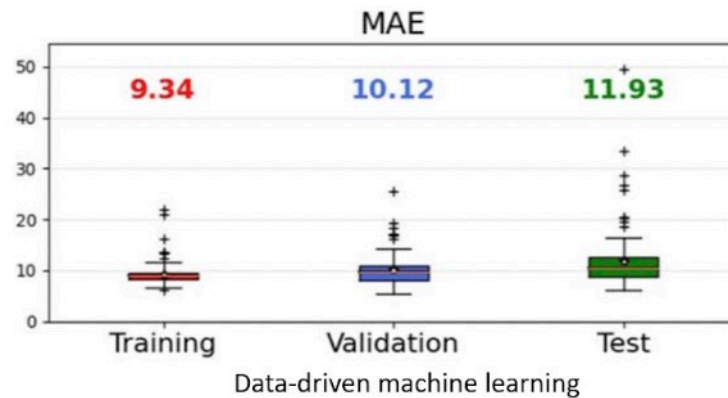


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## Physics-driven Machine Learning for the Prediction of Coronal Mass Ejections' Travel Times



1,2



## comments

- still some issues concerning the calibration of the small STIX grids (work in progress at MIDA)
- model selection for acceleration mechanisms in solar flares
- few data from solar orbiter: transfer learning
- training phase in classification: score-oriented loss functions
- training phase in regression: design of physics-based loss functions
- value-weighted skill scores for performance assessment of AI approaches

MIDA in a nutshell  
mida.unige.it



anna maria massone

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M3

cristina campi, sara garbarino

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methods for image  
and data analysis



andrea tacchino

