

# Probabilistic fire spread prediction

## The case of the deadly wildfire in Mati, Greece

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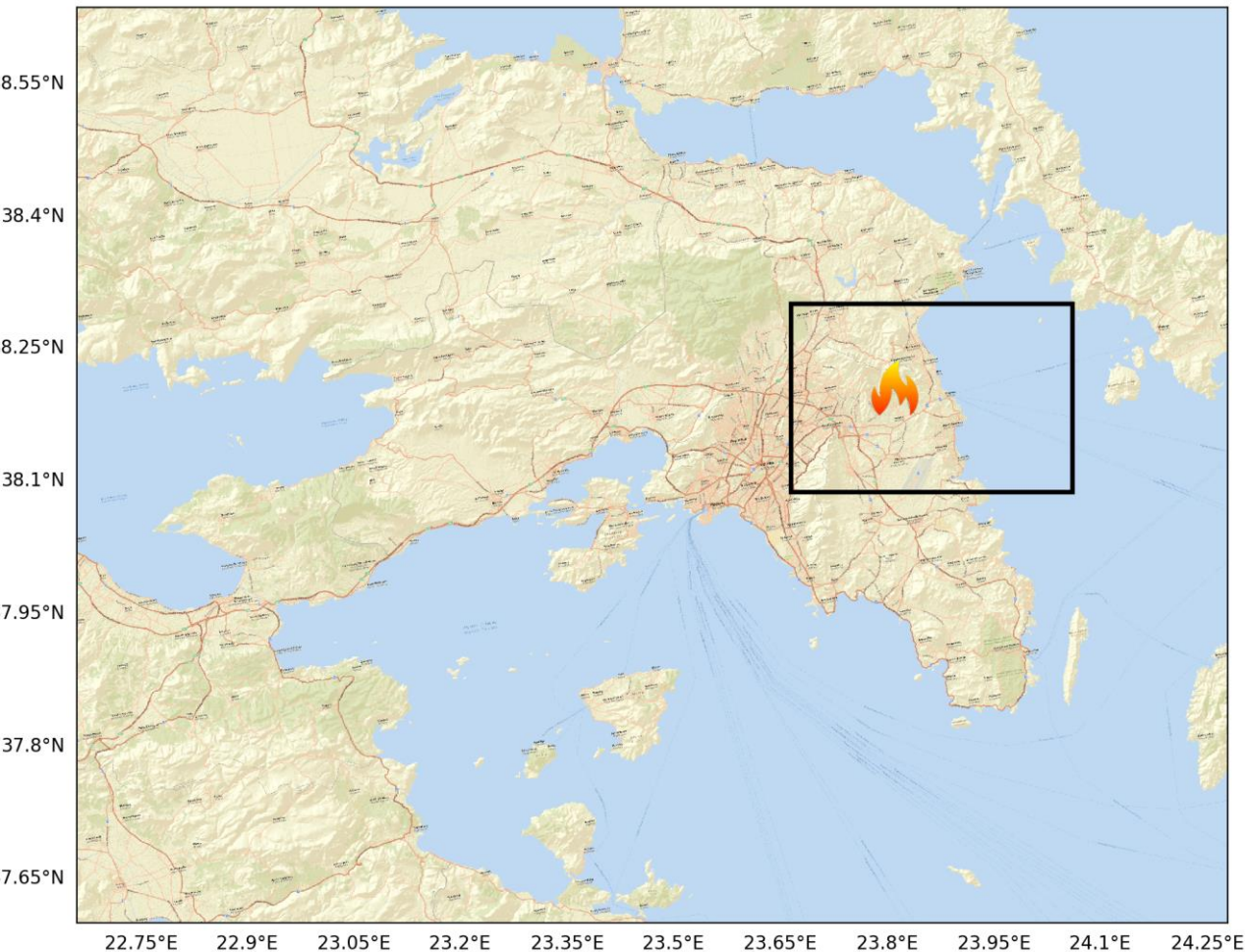
<sup>1</sup>National Observatory of Athens, Institute for Environmental Research and Sustainable Development, Athens, Greece

<sup>2</sup>Joint Research Institute, European Commission, Ispra, Italy

# Background

The wildfire broke up in the **early afternoon** (13:45 UTC) on **Monday July 23, 2018**, at the foothill of the Penteli Mountain, **20 km NE** of the city of **Athens** and **5 km off** the eastern Attica coast.

Assisted by the prevailing meteorological conditions, it spread **erratically**, literally **wiping out** the residential settlement of **Mati** in **less than 2 h**.



Using ECMWF's Forecasts (UEF2019), June 6 2019, ECMWF, Reading, UK



# Aftermath

- ~12.8 km<sup>2</sup> were burnt (1276 ha).
- >1,000 buildings were totally destroyed.
- 305 vehicles were burnt.
- 101 civilian fatalities.

The **Mati wildfire** is the **2<sup>nd</sup> deadliest natural disaster** in **Greece's** modern history.

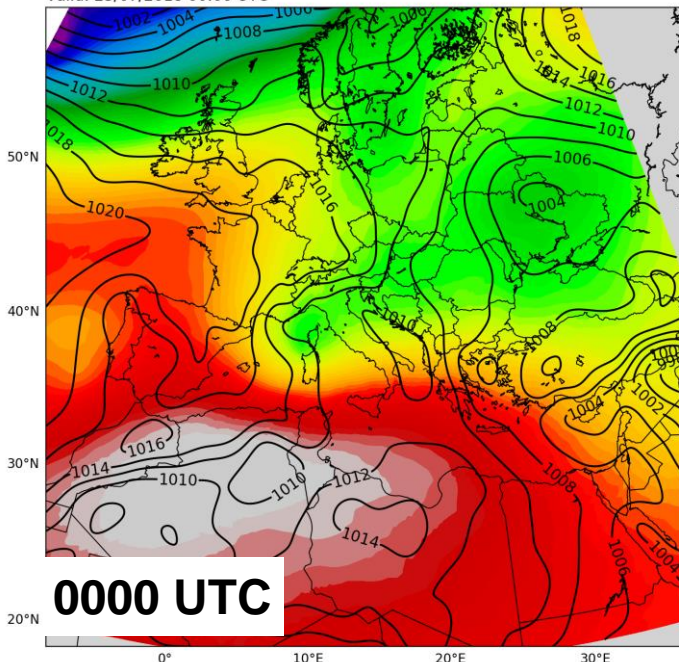




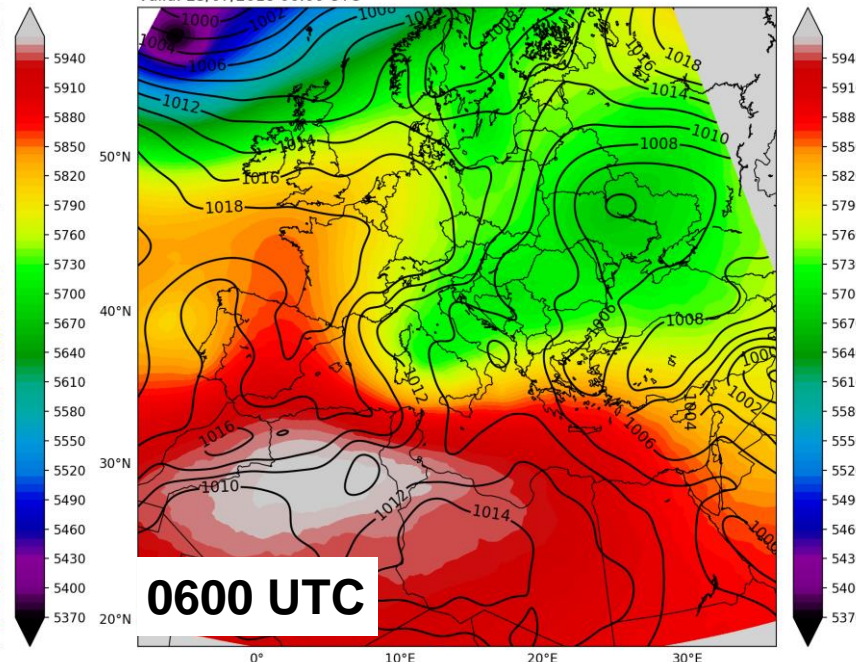
# Overview: Synoptic environment

[1]

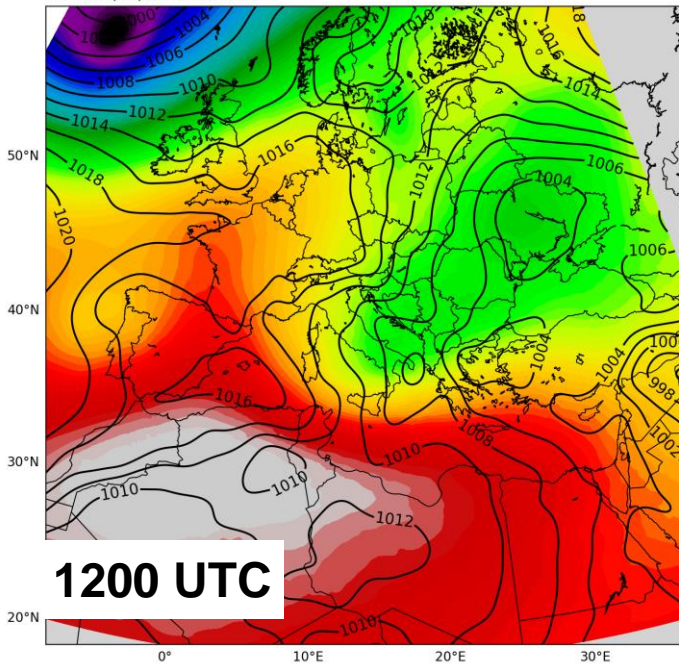
ECMWF Operational Analysis (0.1°x0.1°)  
Sea-level pressure (hPa) & 500hPa geopotential height (m)  
Valid: 23/07/2018 00:00 UTC



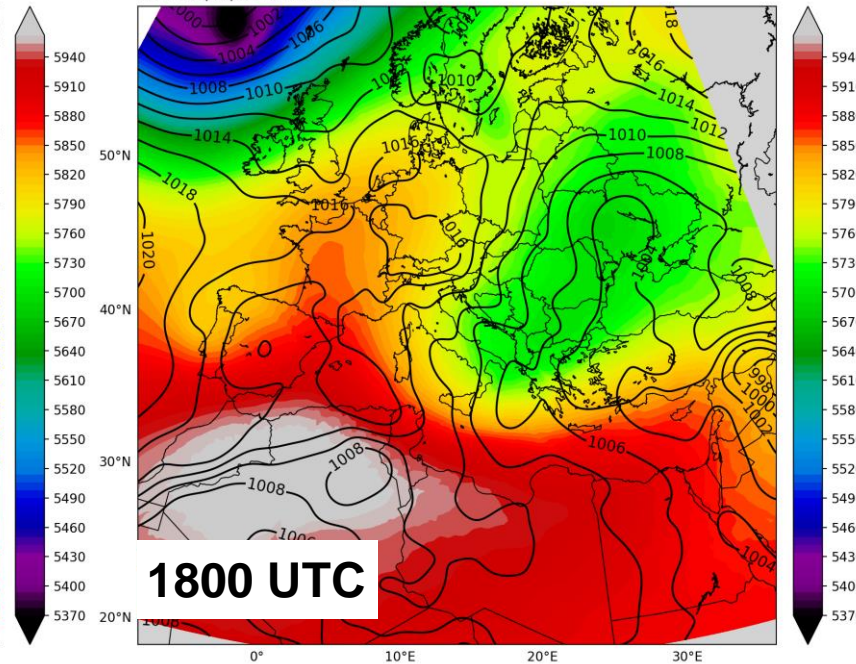
ECMWF Operational Analysis (0.1°x0.1°)  
Sea-level pressure (hPa) & 500hPa geopotential height (m)  
Valid: 23/07/2018 06:00 UTC



ECMWF Operational Analysis (0.1°x0.1°)  
Sea-level pressure (hPa) & 500hPa geopotential height (m)  
Valid: 23/07/2018 12:00 UTC



ECMWF Operational Analysis (0.1°x0.1°)  
Sea-level pressure (hPa) & 500hPa geopotential height (m)  
Valid: 23/07/2018 18:00 UTC



**July 23, 2018**  
**Ridge breakdown**  
**due to approaching**  
**upper-level trough.**

**Shallow (1004 hPa)**  
**low-pressure system**  
**over NE Aegean Sea.**

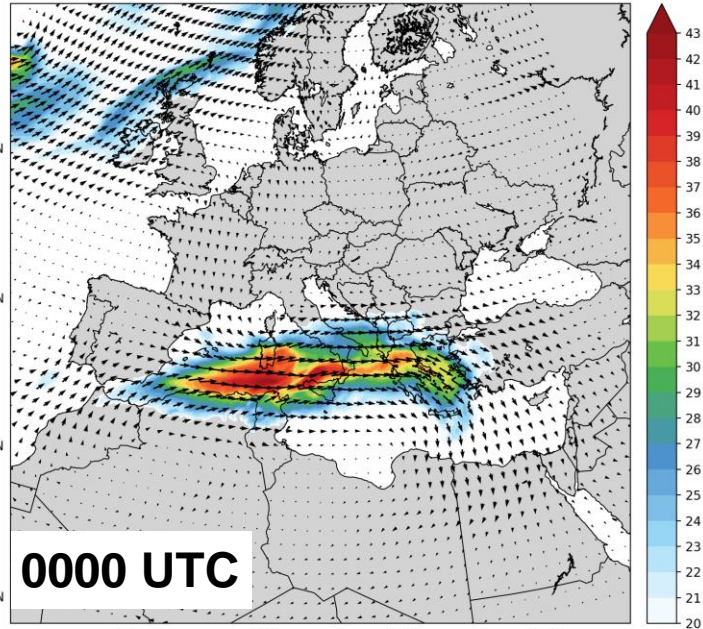
**Subtropical ridge.**



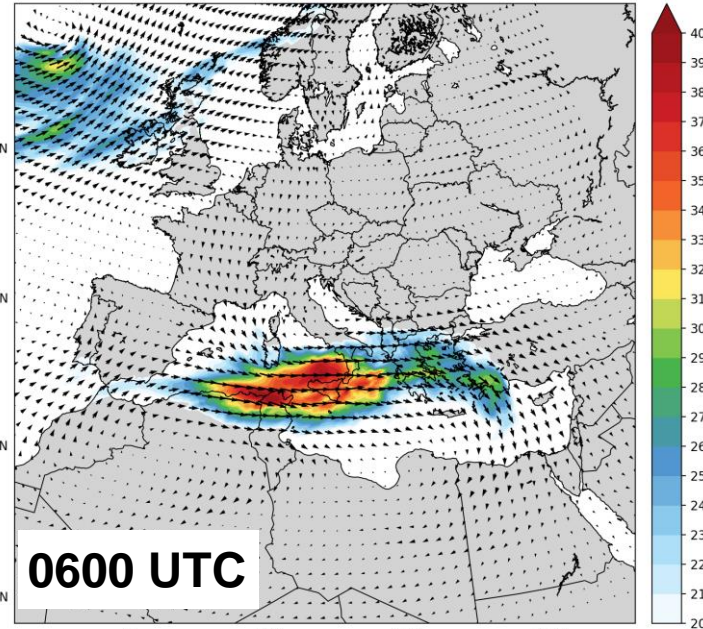
# Overview: Synoptic environment

[2]

ECMWF Operational Analysis (0.1°x0.1°)  
500hPa wind (m s<sup>-1</sup>)  
Valid: 23/07/2018 00:00 UTC



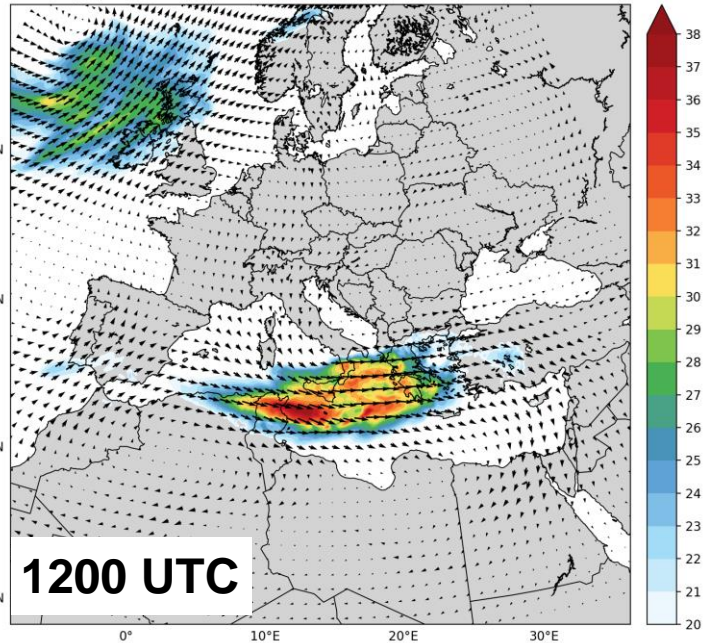
ECMWF Operational Analysis (0.1°x0.1°)  
500hPa wind (m s<sup>-1</sup>)  
Valid: 23/07/2018 06:00 UTC



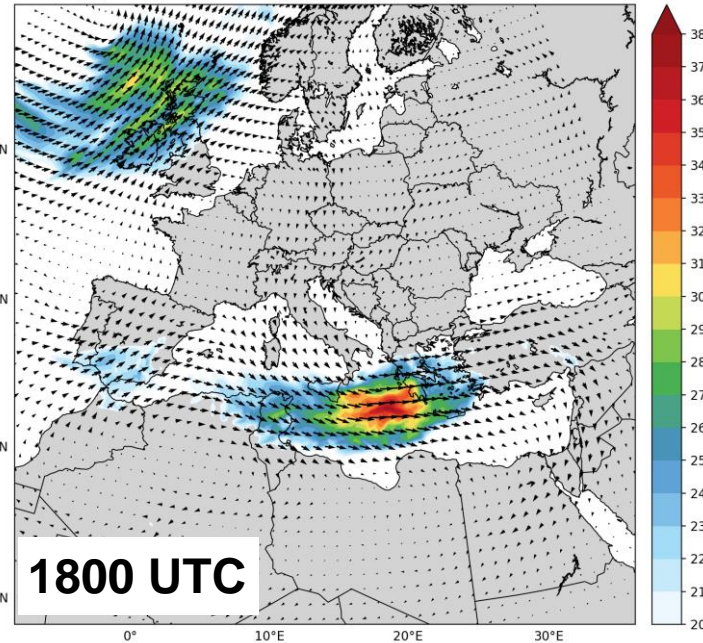
**July 23, 2018**  
**Subtropical jet stream** extending from S Italy to Greece.

**25-30 m s<sup>-1</sup> peak winds.**

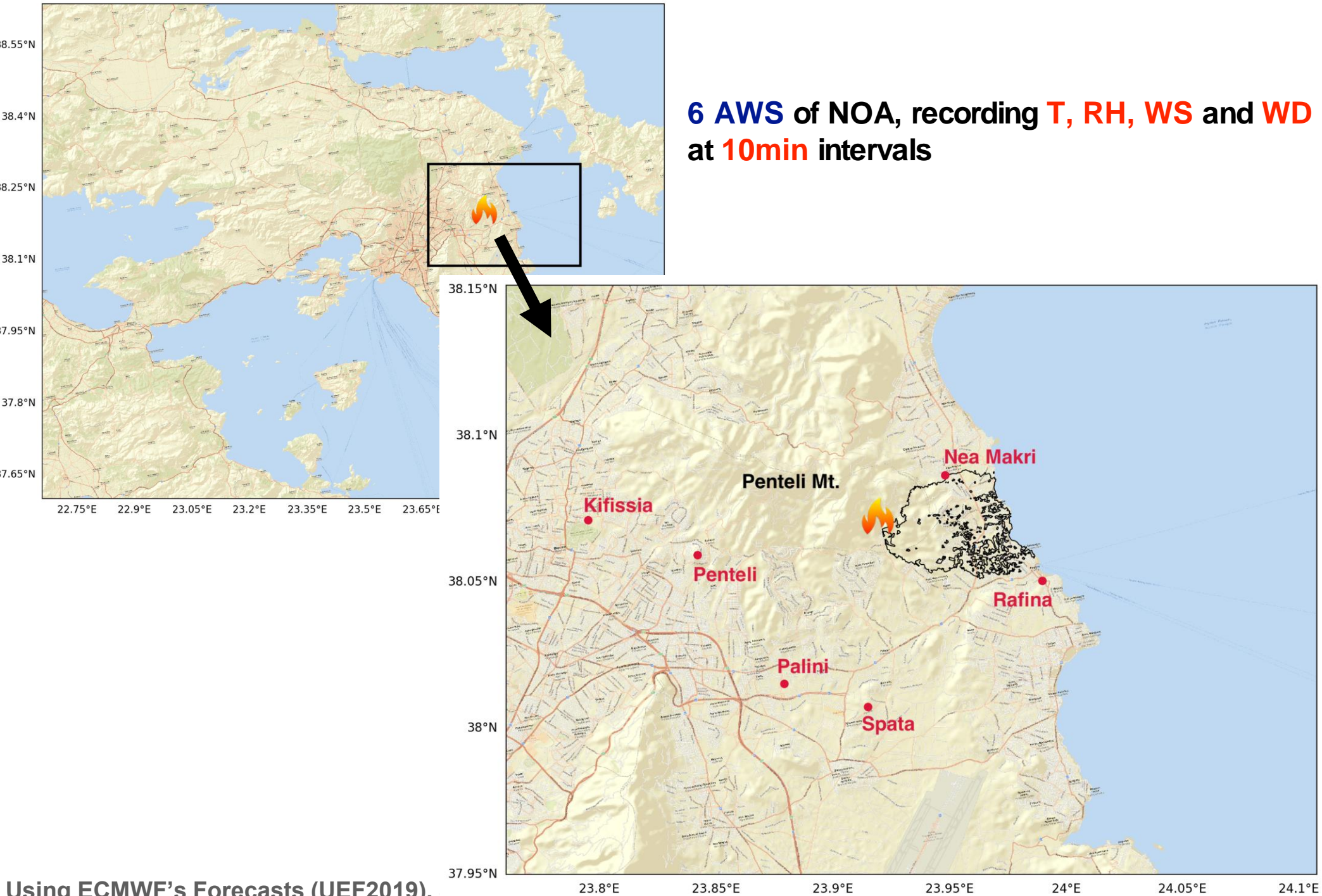
ECMWF Operational Analysis (0.1°x0.1°)  
500hPa wind (m s<sup>-1</sup>)  
Valid: 23/07/2018 12:00 UTC



ECMWF Operational Analysis (0.1°x0.1°)  
500hPa wind (m s<sup>-1</sup>)  
Valid: 23/07/2018 18:00 UTC

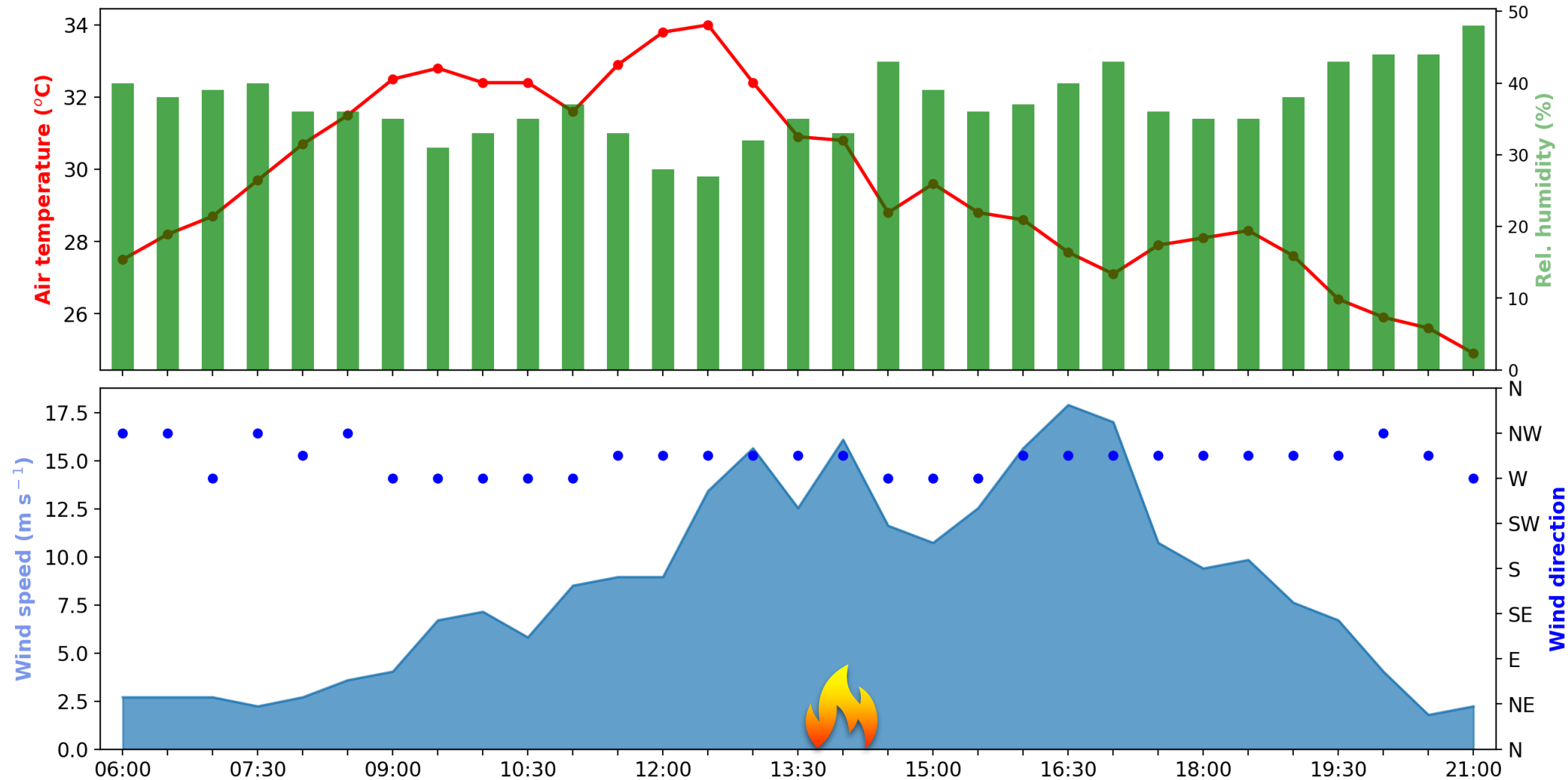






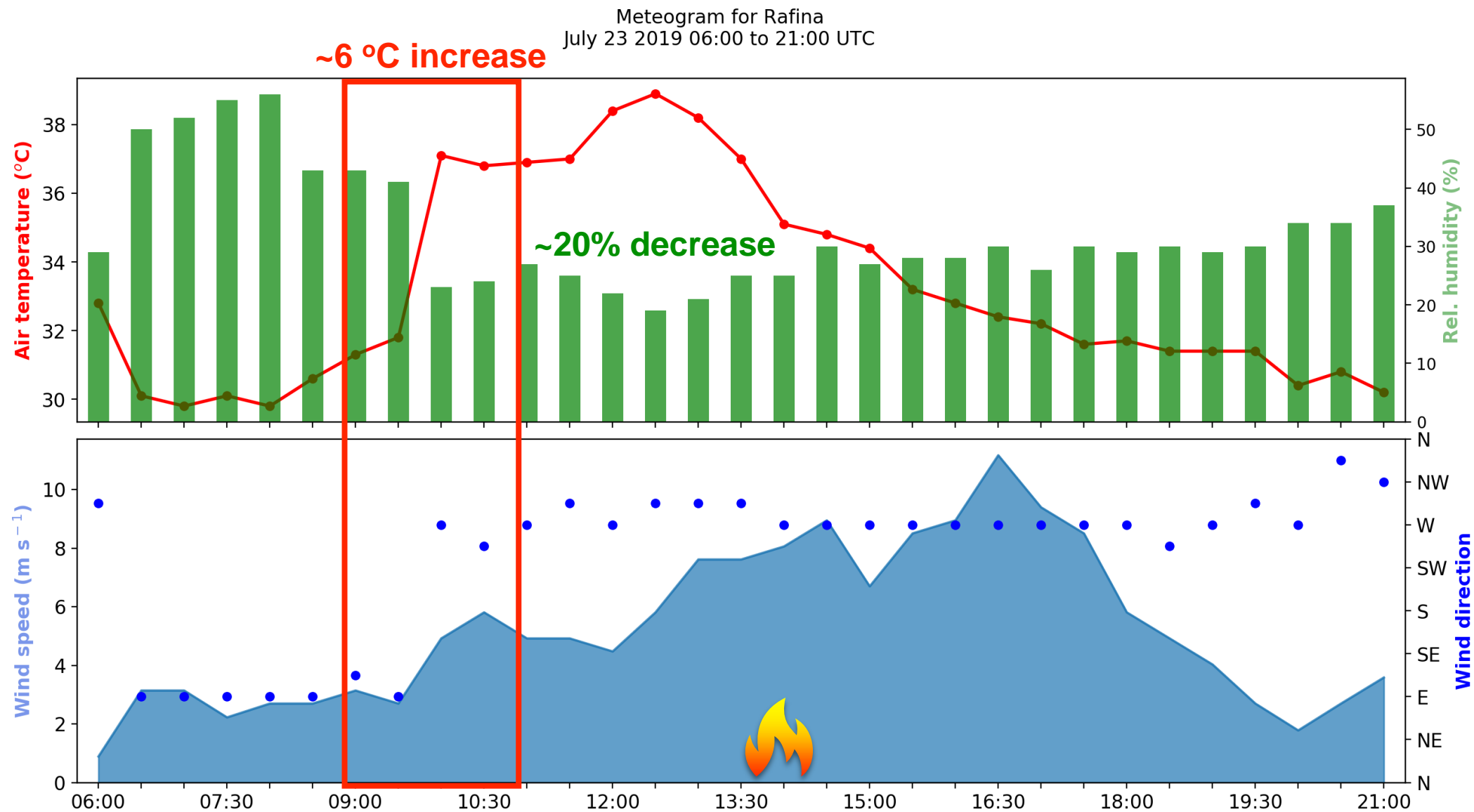


Meteogram for Penteli  
July 23 2019 06:00 to 21:00 UTC



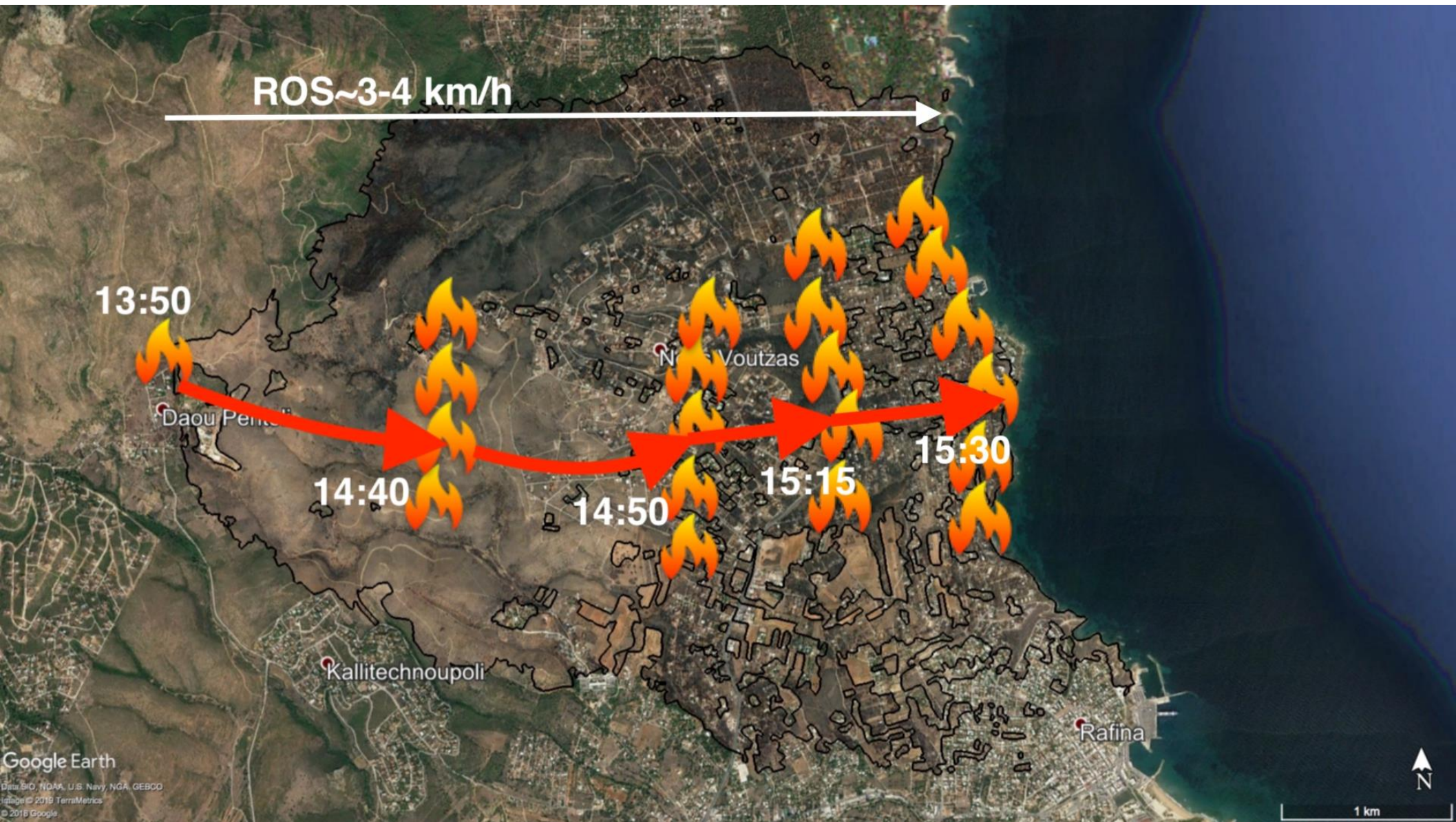
**W/NW** winds **>15 m s<sup>-1</sup>** prior to fire ignition, peaking at **~18 m s<sup>-1</sup>** (**~65 km h<sup>-1</sup>**) during active fire spread.





**Rapid dry-out** of fine fuels **prior** to fire ignition. **W** winds **8-10 m s<sup>-1</sup>** during active fire spread.

# Overview: Fire spread



Based on evidence collected by the National and Kapodistrian University of Athens ([https://edcm.edu.gr/images/docs/2018/Newsletter\\_Attica\\_Fires\\_2018\\_v11.pdf](https://edcm.edu.gr/images/docs/2018/Newsletter_Attica_Fires_2018_v11.pdf))

Using ECMWF's Forecasts (UEF2019), June 6 2019, ECMWF, Reading, UK



# Objectives



**IRIS**: rapid Response fire Spread forecasting system for Greece, based on the coupled fire-atmosphere WRF-Fire modelling system (Munoz-Esparza et al., 2018) and supported by a prototype fuel models' map derived from products of the Copernicus Land Monitoring Service.

Pre-operational implementation during 2018 fire season; Fully operational during 2019 fire season

Two-way coupling between the fire and the atmosphere (via heat/vapour fluxes); Rapid-response

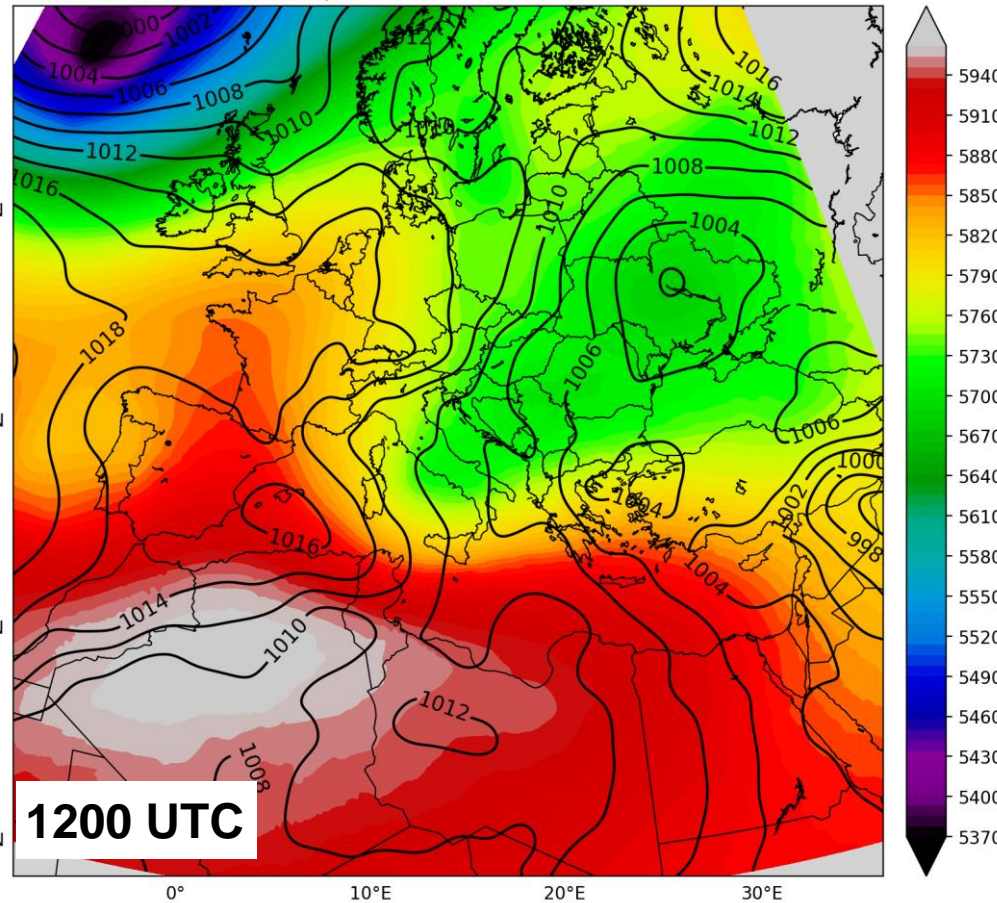
Could ECMWF's EPS be used (and how?) for providing an early warning?

Does driving IRIS with ECMWF's EPS provide added-value for fire spread forecasting?

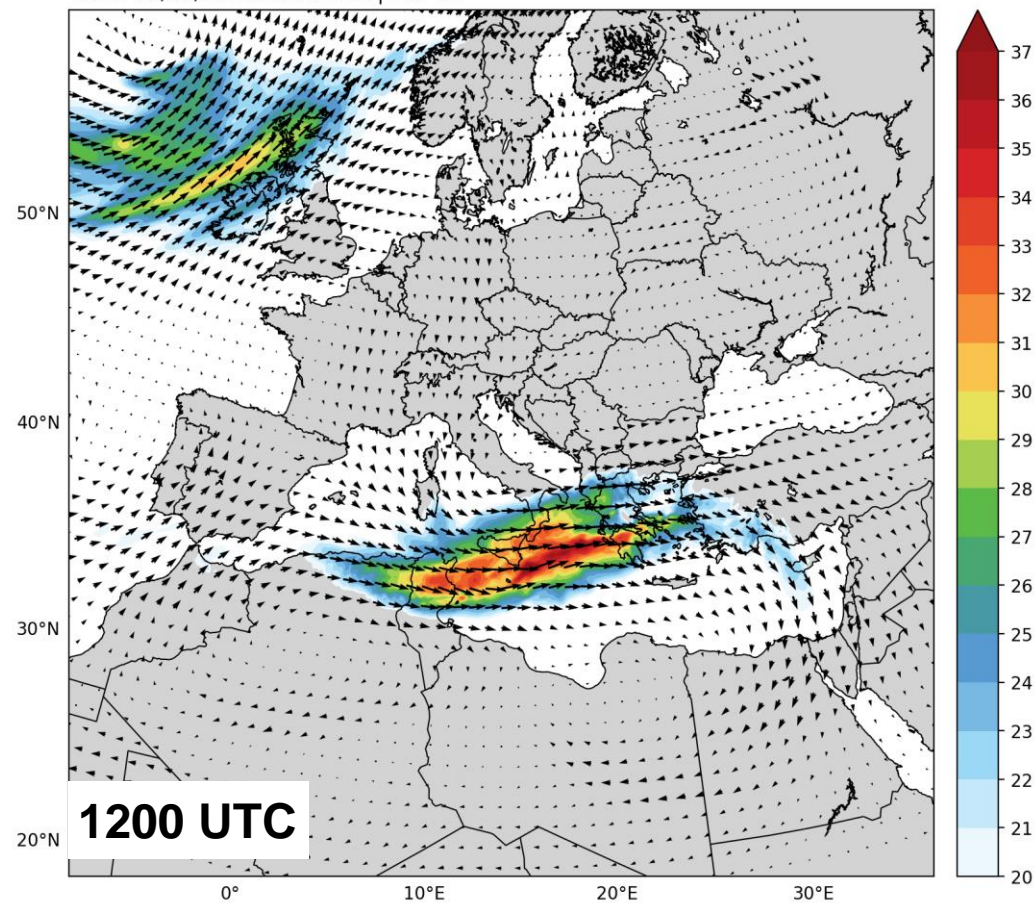


Using ECMWF's Forecasts (UEF2019), June 6 2019, ECMWF, Reading, UK

ECMWF IFS CY45R1 (0.1°x0.1°)  
Sea-level pressure (hPa) & 500hPa geopotential height (m)  
Valid: 23/07/2018 12:00 UTC | T0+48



ECMWF IFS CY45R1 (0.1°x0.1°)  
500hPa wind ( $\text{m s}^{-1}$ )  
Valid: 23/07/2018 12:00 UTC | T0+48



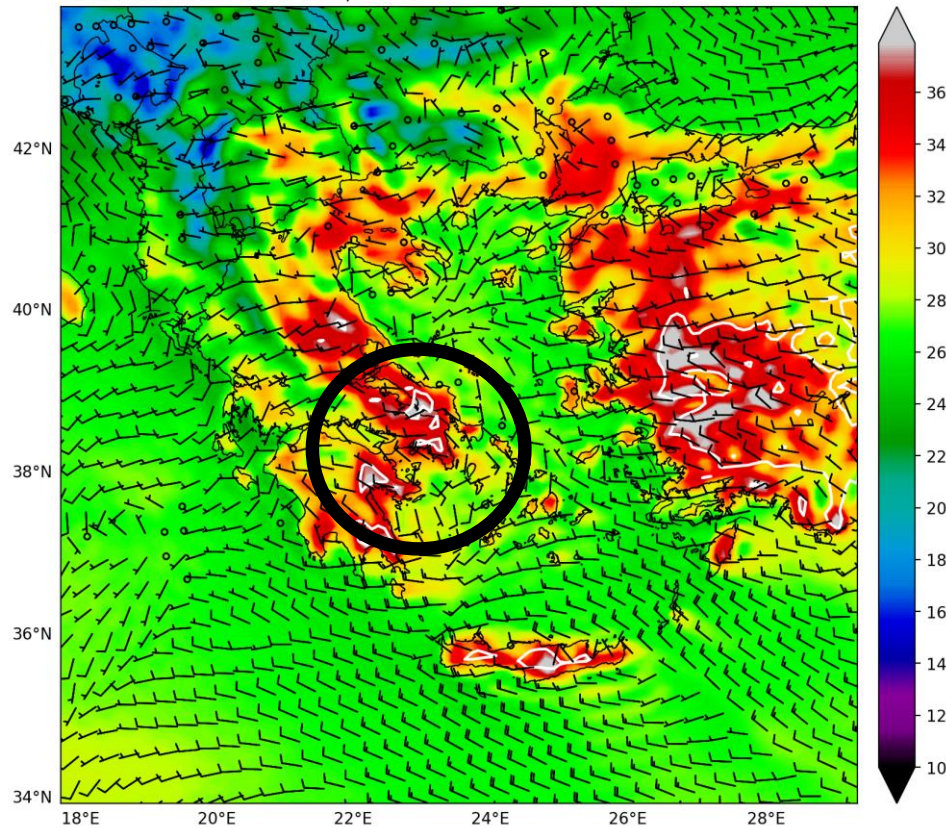
The **key ingredients** for potentially **extreme fire behaviour** are present in the deterministic forecast:

- **Ridge break-down.**
- **Approaching upper-level trough.**
- **Mid-level subtropical jet stream ( $\sim 30 \text{ m s}^{-1}$ ) over S Greece.**

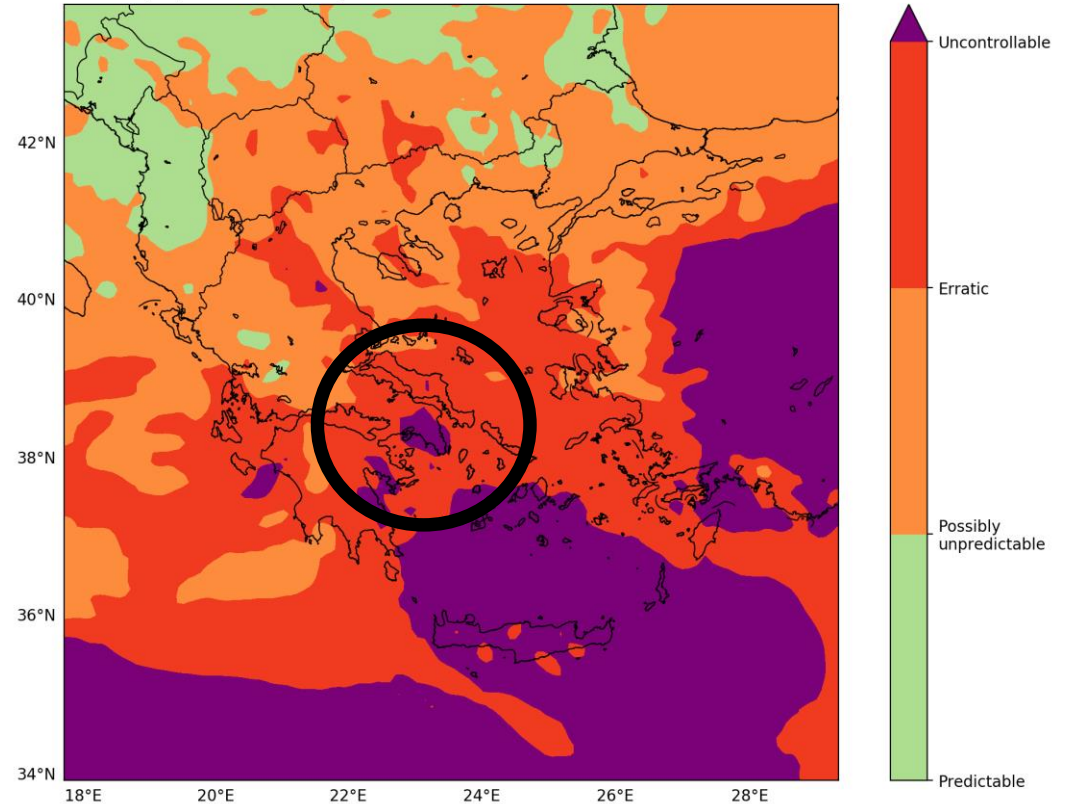
**Critical fire weather pattern**



ECMWF IFS CY45R1 (0.1°x0.1°)  
2m air temperature (shaded, °C)  
2m relative humidity (contours below 20%)  
10m wind barbs  
Valid: 23/07/2018 12:00 UTC | T0+48



ECMWF IFS CY45R1 (0.1°x0.1°)  
Likely fire behavior based on Continuous Haines Index  
Valid: 23/07/2018 12:00 UTC | T0+48



Deterministic forecast guidance for conditions highly conducive for **extreme fire behaviour** in Attica.

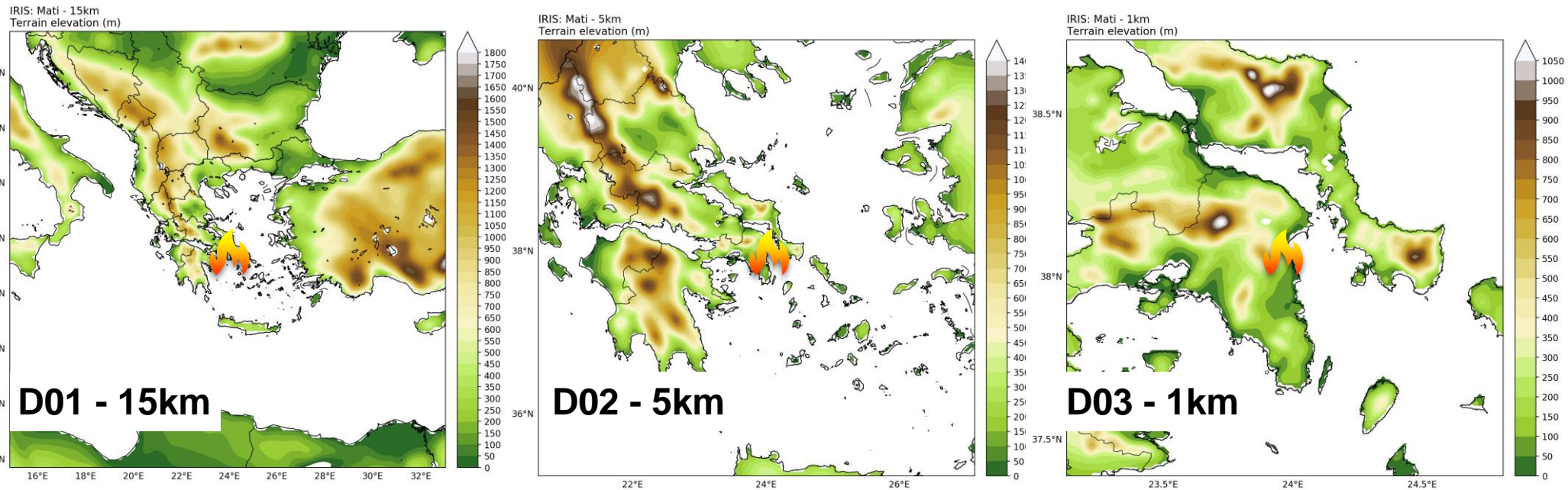
**Trigger alarm** for potentially dangerous conditions in Attica; Employ **ECMWF EPS** for gaining further insight.

# IRIS: Configuration - Atmospheric model (WRF)

Three 2-way nested modelling domains, centred around fire ignition: 15 - 5 - 1 km.

Initialisation: ECMWF EPS of 21/07/2018, ~16km resolution (T0+48).

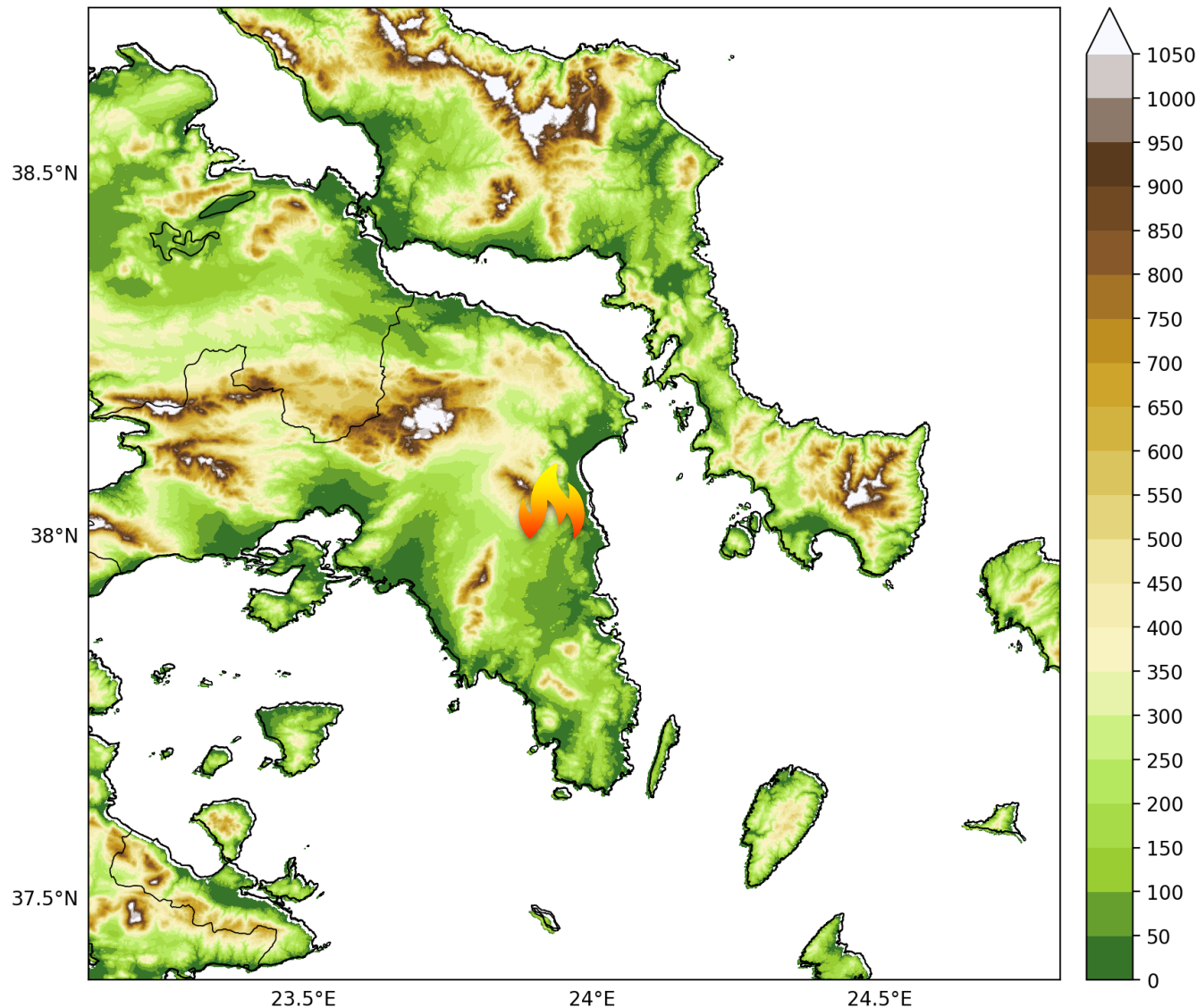
Simulations: 50 (EPS members) + 1 (EPS control) + 1 (IFS CY45R1)





# IRIS: Configuration - Fire spread model (Fire)

IRIS: Mati - 100m  
Terrain elevation (m)



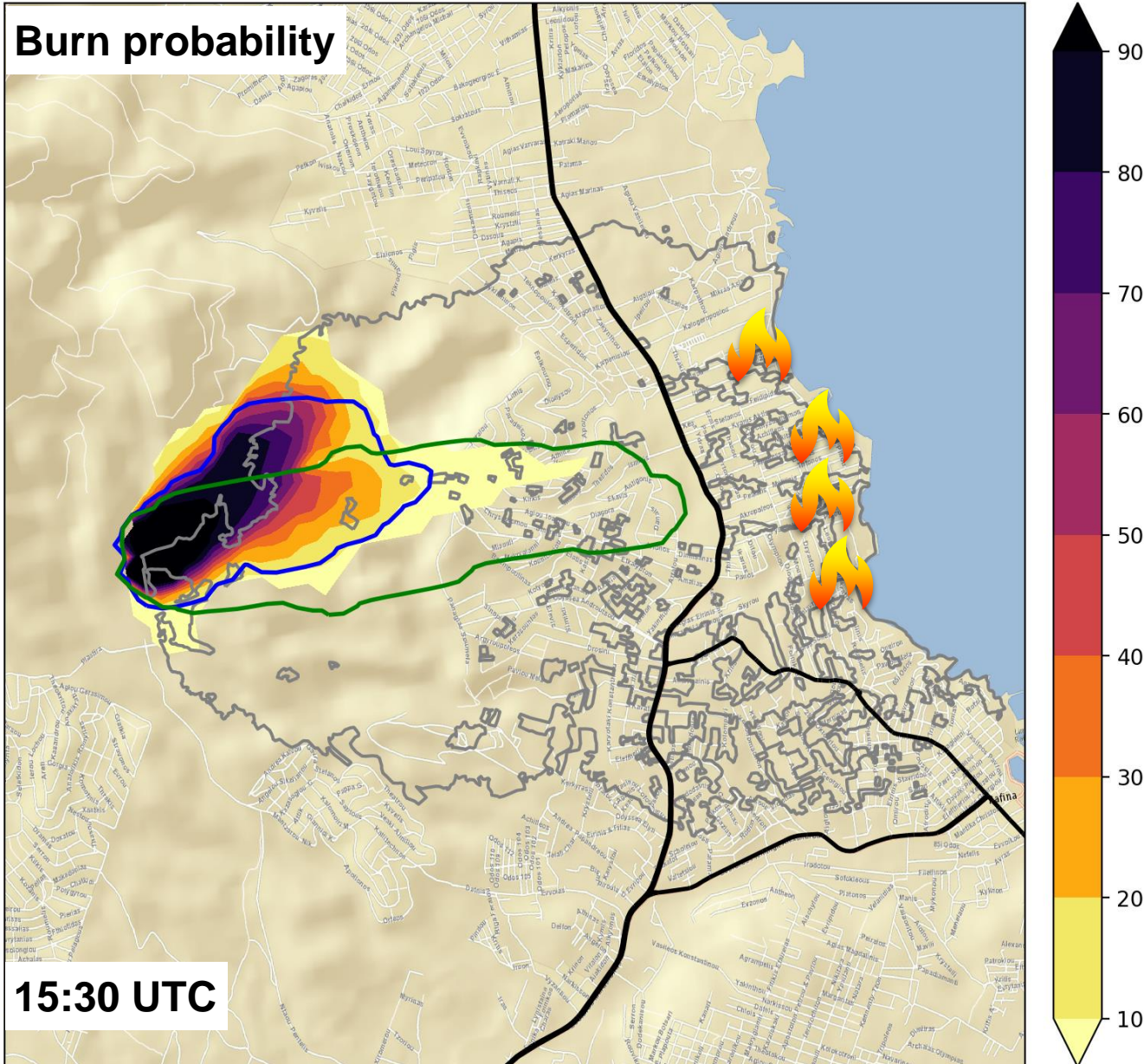
**Ultra-high-resolution domain (100m)** embedded as **sub-grid** within the 1km atmospheric domain:

- **90m SRTM** topography.
- **100m fuel models** (based on Copernicus Land Monitoring Service products).

**Fire spread** simulated with the **level-set method** (Munoz-Esparza et al., 2018).

**~10min integration time per 6h of forecast**

IRIS: Mati Wildfire - 100m  
ECMWF EPS init.: 21/07/2018 12Z  
Burn probability (shaded, %)  
Green (contour): Deterministic | Blue (contour): Control  
Valid: 23/07/2018 15:30Z

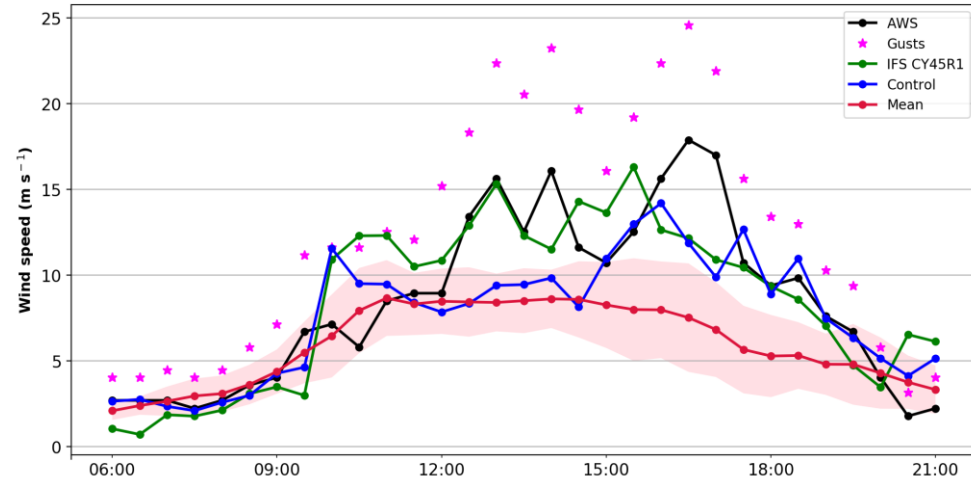


EPS **fails** to provide added-value guidance.

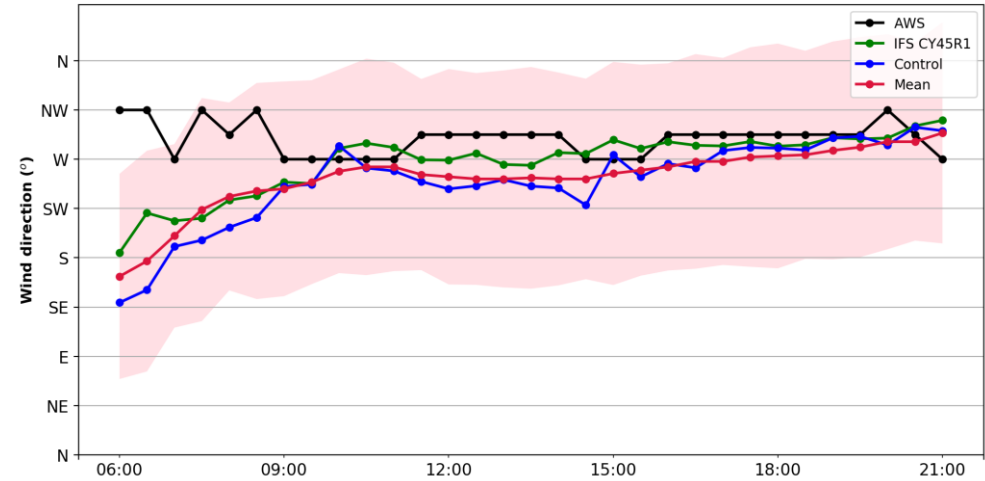
- **Limited** fire spread.
- **NE movement** of the fire front.



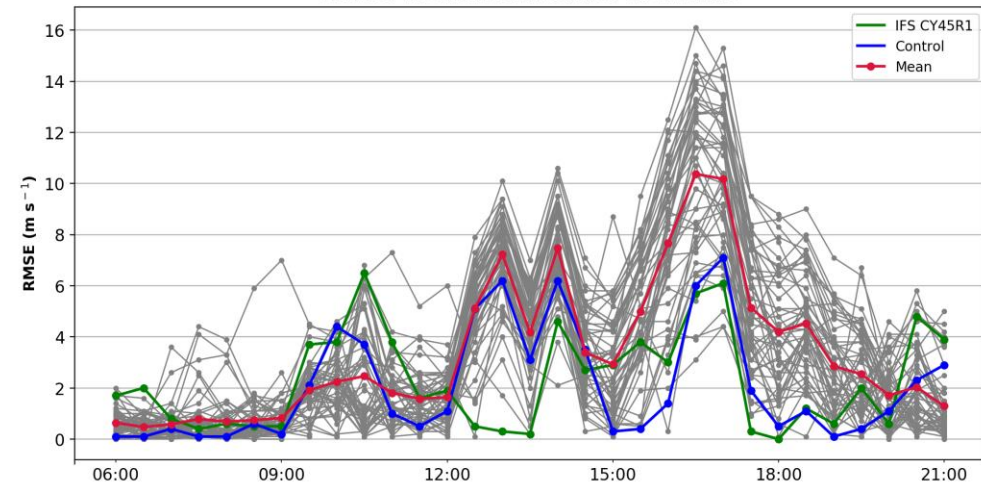
AWS: Penteli - Mati 2018 wildfire  
2018-07-23 06:00:00 to 2018-07-23 21:00:00



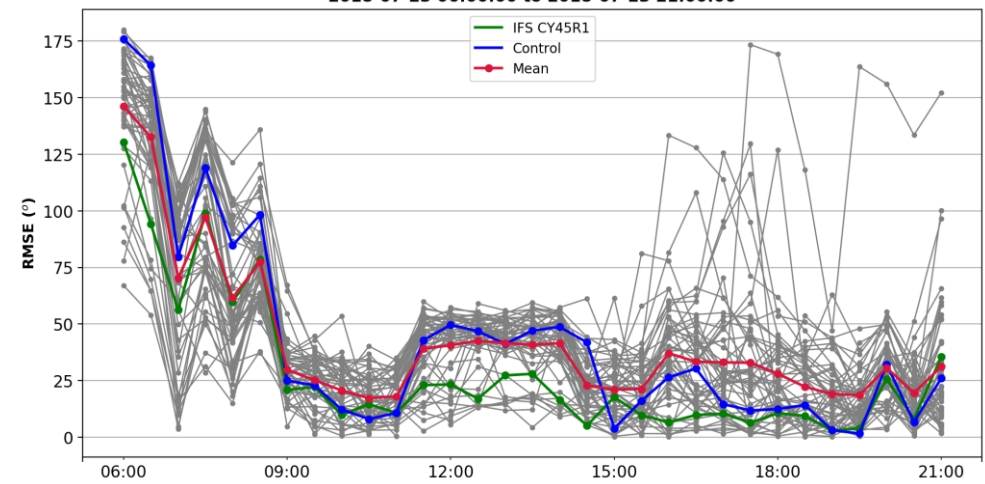
AWS: Penteli - Mati 2018 wildfire  
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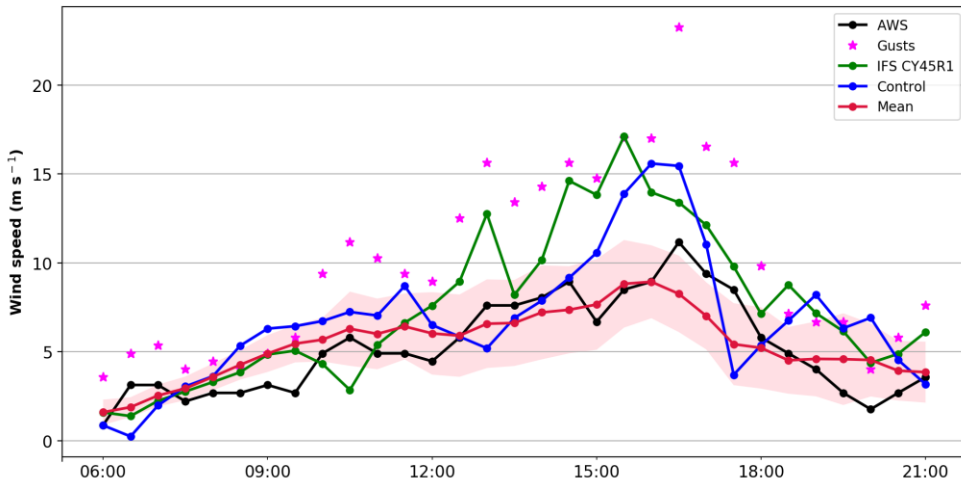
AWS: Penteli - Mati 2018 wildfire  
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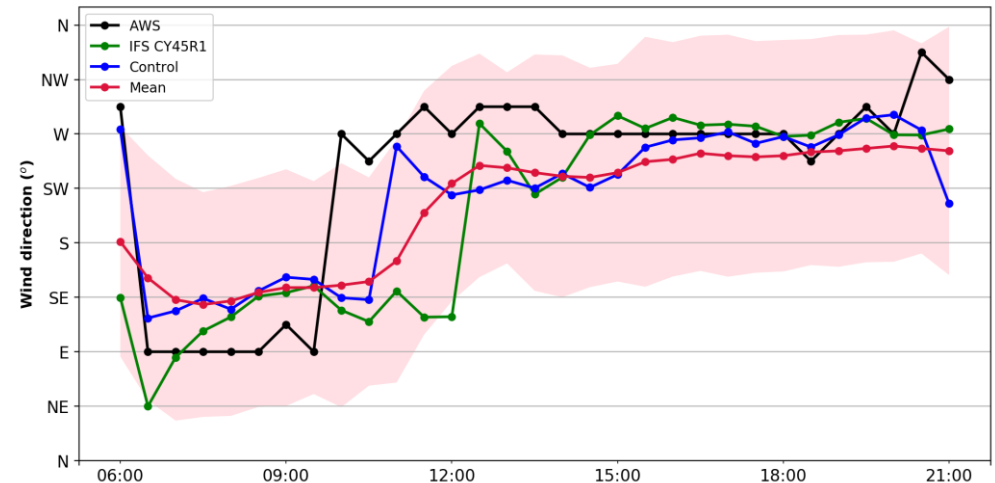
**CY45R1:  $3 \text{ m s}^{-1}$ ,  $42.5^\circ$**

**EPS:  $4.2 \text{ m s}^{-1}$ ,  $50.9^\circ$**

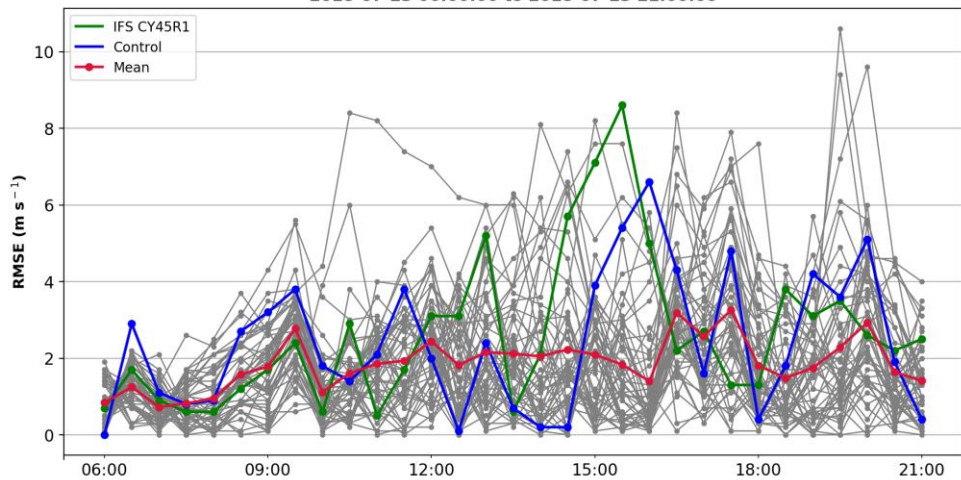
AWS: Rafina - Mati 2018 wildfire  
2018-07-23 06:00:00 to 2018-07-23 21:00:00



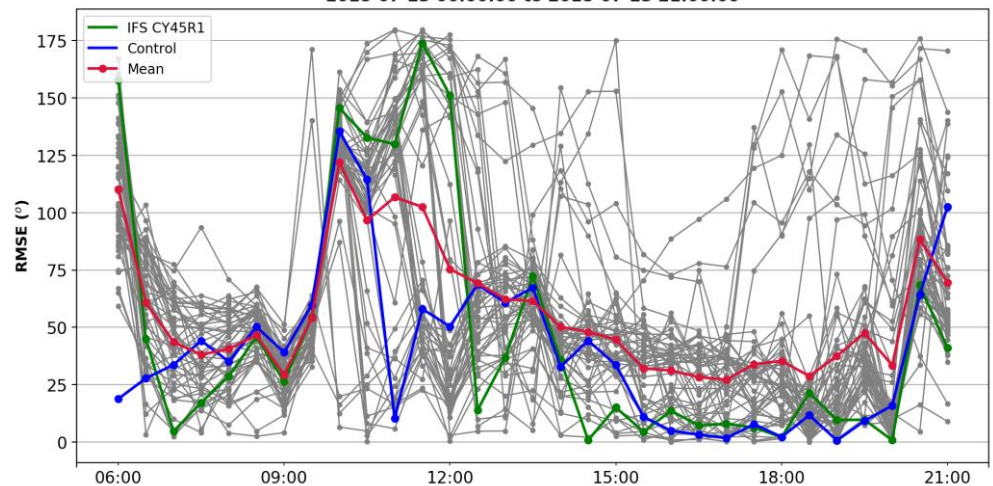
AWS: Rafina - Mati 2018 wildfire  
2018-07-23 06:00:00 to 2018-07-23 21:00:00



AWS: Rafina - Mati 2018 wildfire  
2018-07-23 06:00:00 to 2018-07-23 21:00:00



AWS: Rafina - Mati 2018 wildfire  
2018-07-23 06:00:00 to 2018-07-23 21:00:00



**CY45R1:  $3.3 \text{ m s}^{-1}$ ,  $71.4^\circ$**

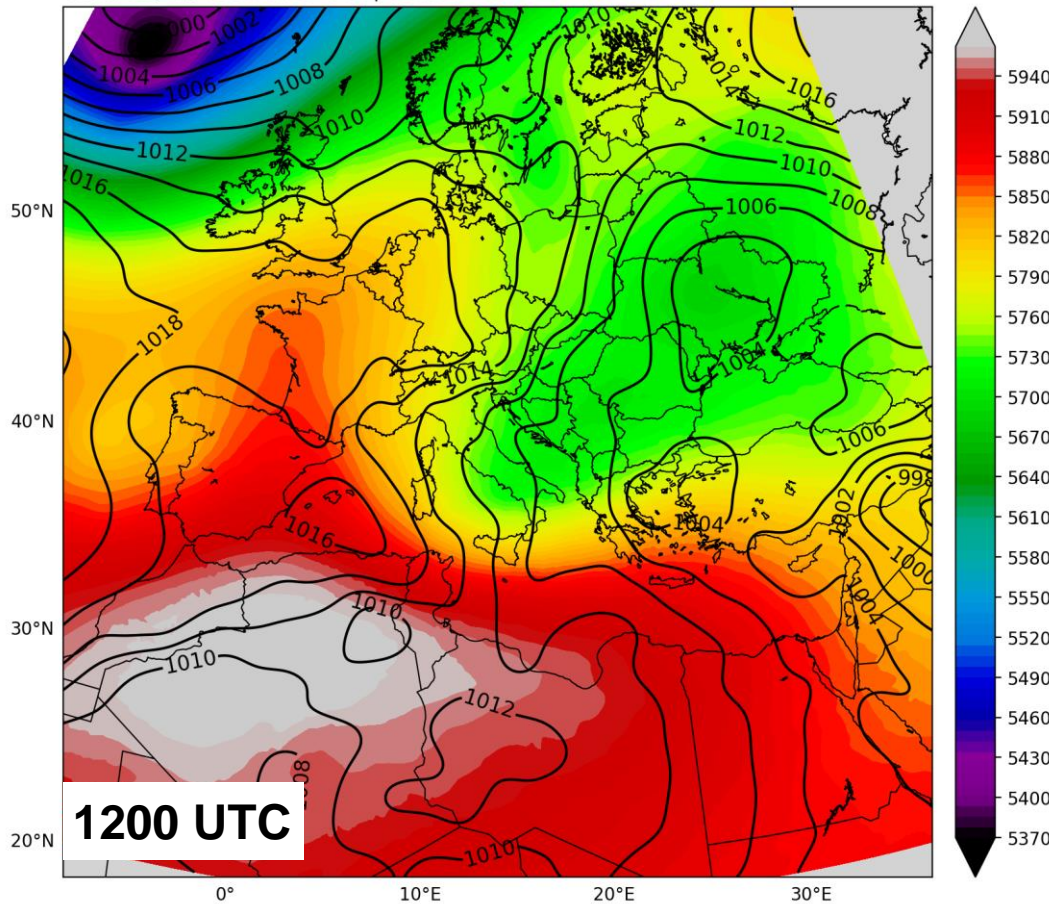
**EPS:  $1.5 \text{ m s}^{-1}$ ,  $56.3^\circ$**



ECMWF IFS CY45R1 (0.1°x0.1°)

Sea-level pressure (hPa) & 500hPa geopotential height (m)

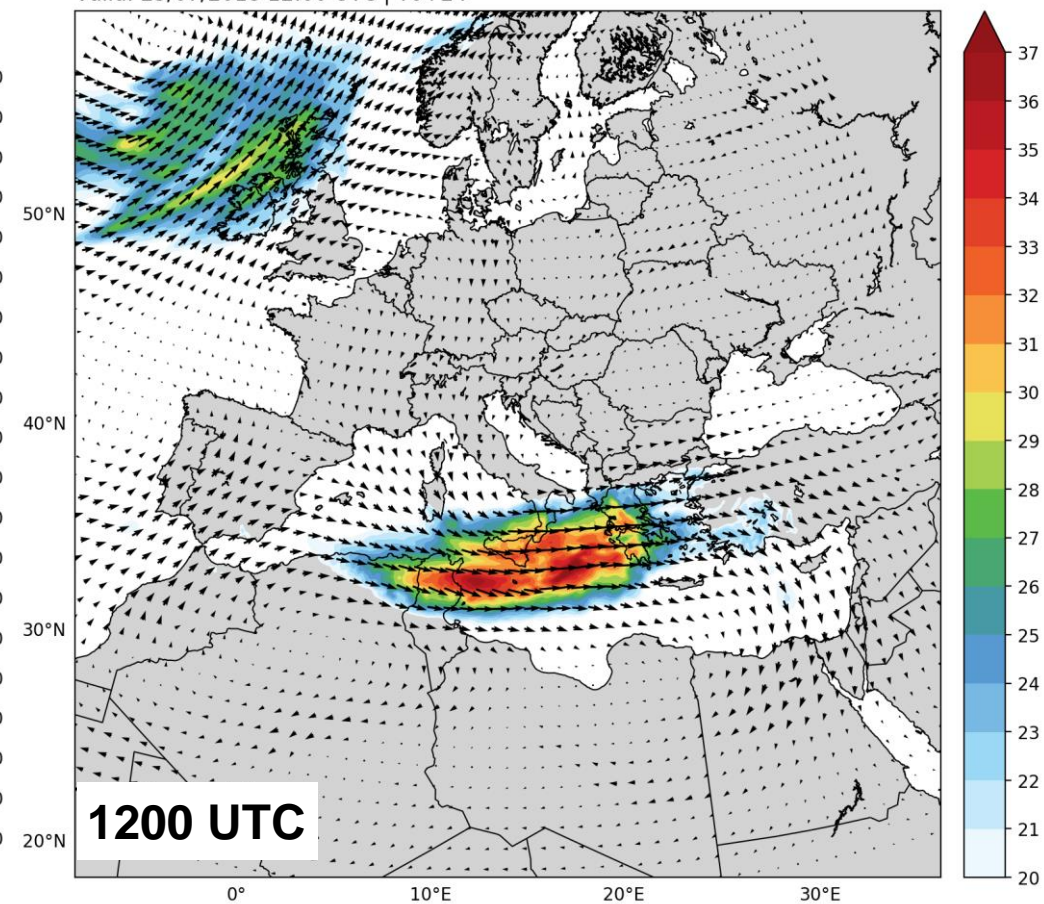
Valid: 23/07/2018 12:00 UTC | T0+24



ECMWF IFS CY45R1 (0.1°x0.1°)

500hPa wind (m s<sup>-1</sup>)

Valid: 23/07/2018 12:00 UTC | T0+24



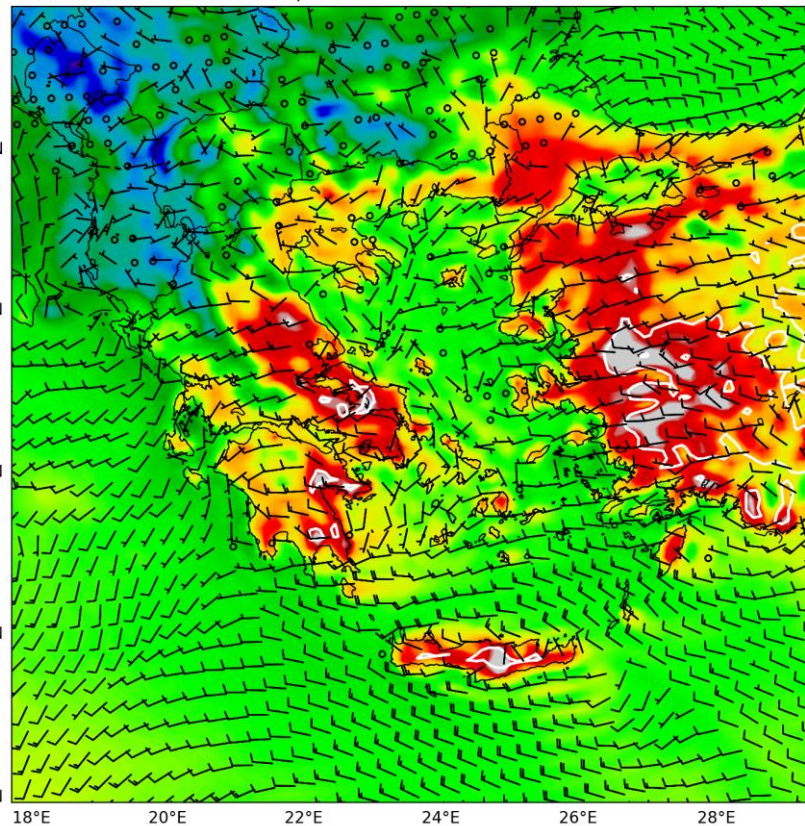
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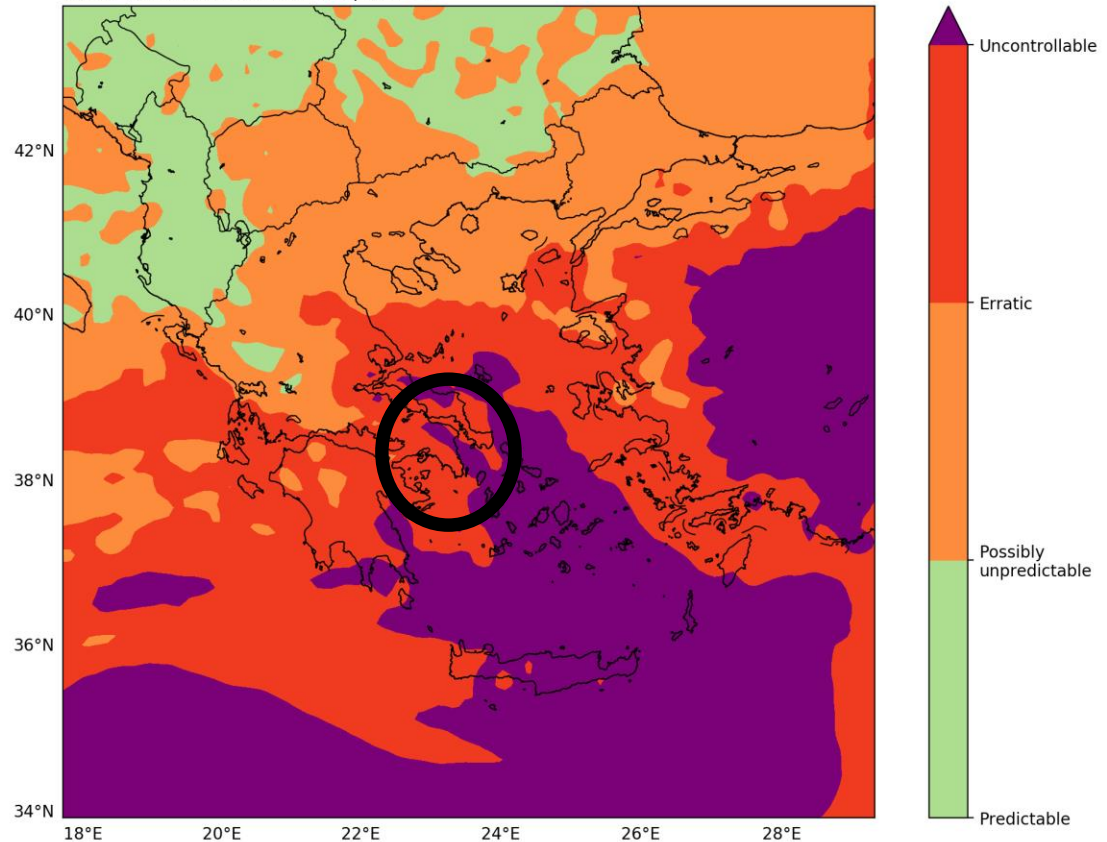
**Critical fire weather pattern**



ECMWF IFS CY45R1 (0.1°x0.1°)  
2m air temperature (shaded, °C)  
2m relative humidity (contours below 20%)  
10m wind barbs  
Valid: 23/07/2018 12:00 UTC | T0+24



ECMWF IFS CY45R1 (0.1°x0.1°)  
Likely fire behavior based on Continuous Haines Index  
Valid: 23/07/2018 12:00 UTC | T0+24



Deterministic forecast guidance for conditions highly conducive for **extreme fire behaviour** in **Eastern Attica**.

**Trigger alarm** for potentially dangerous conditions in **Eastern Attica**; Employ **ECMWF EPS** for gaining further insight.



IRIS: Mati Wildfire - 100m

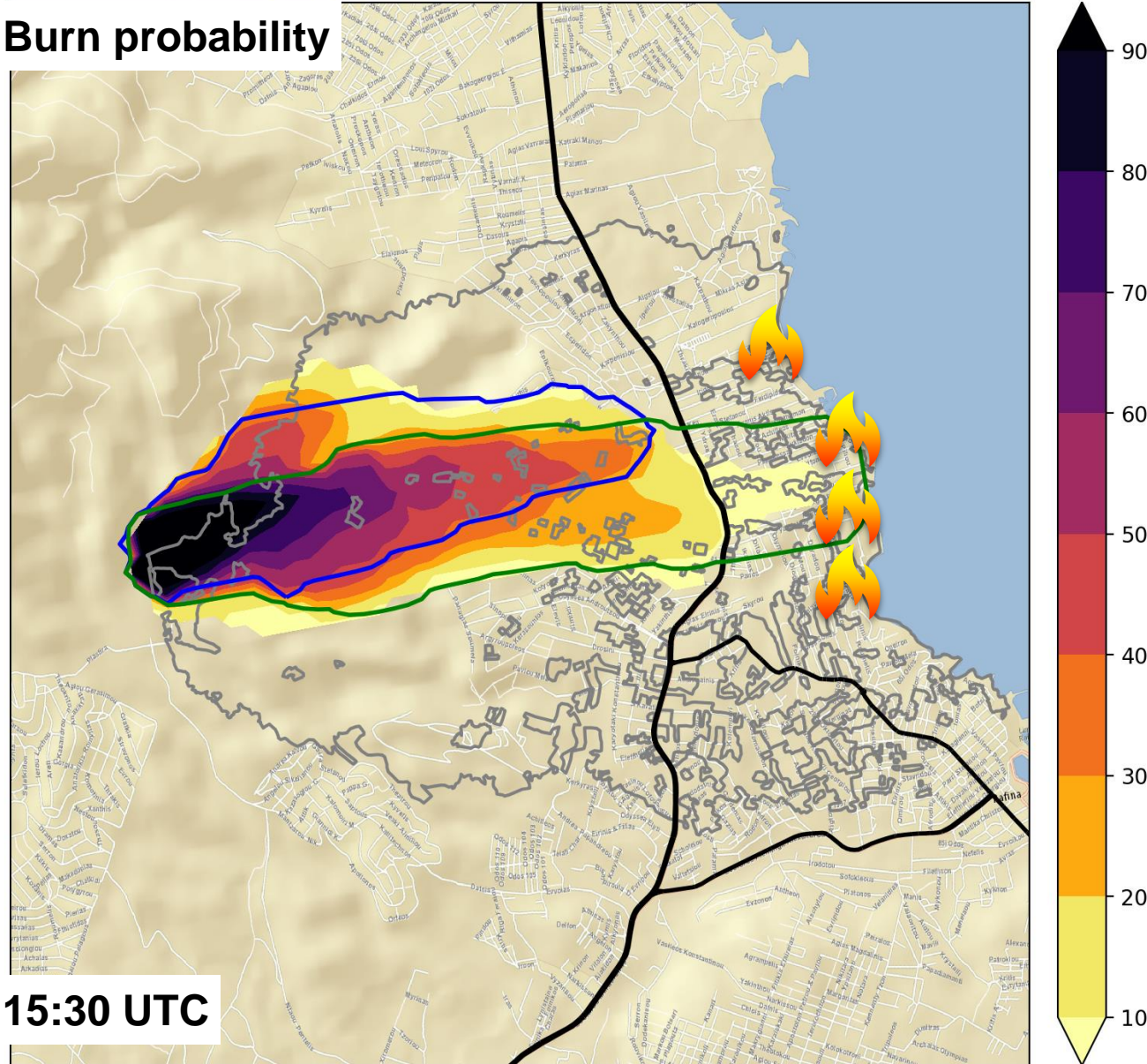
ECMWF EPS init.: 22/07/2018 12Z

Burn probability (shaded, %)

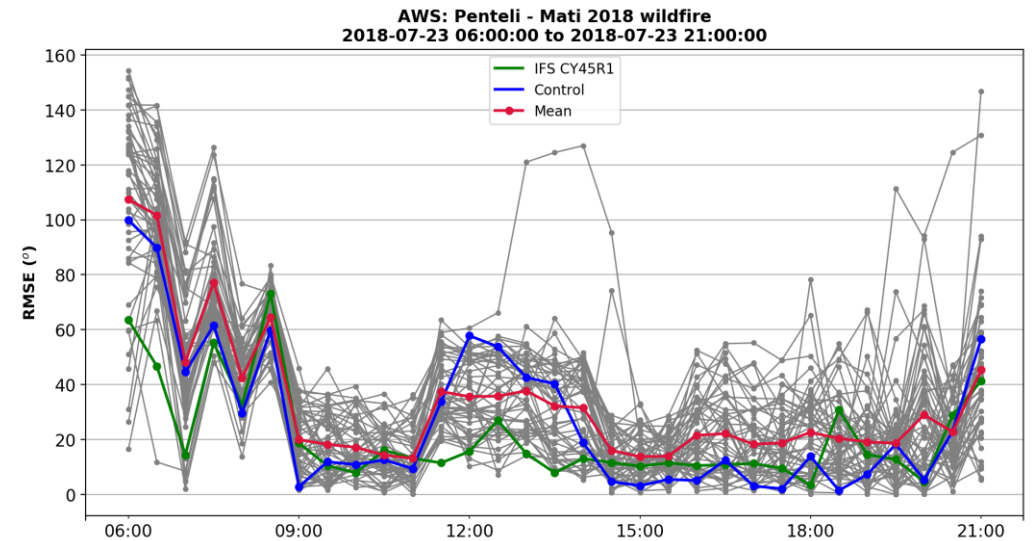
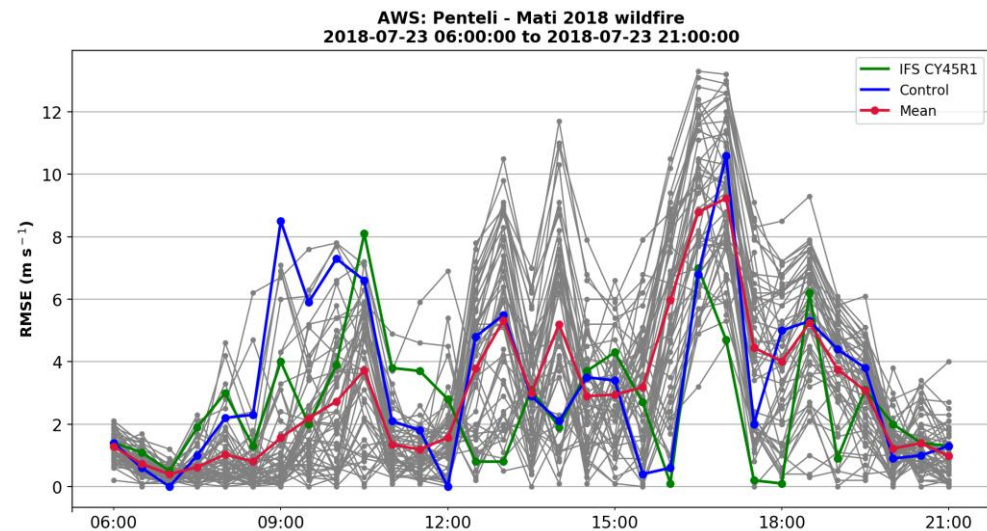
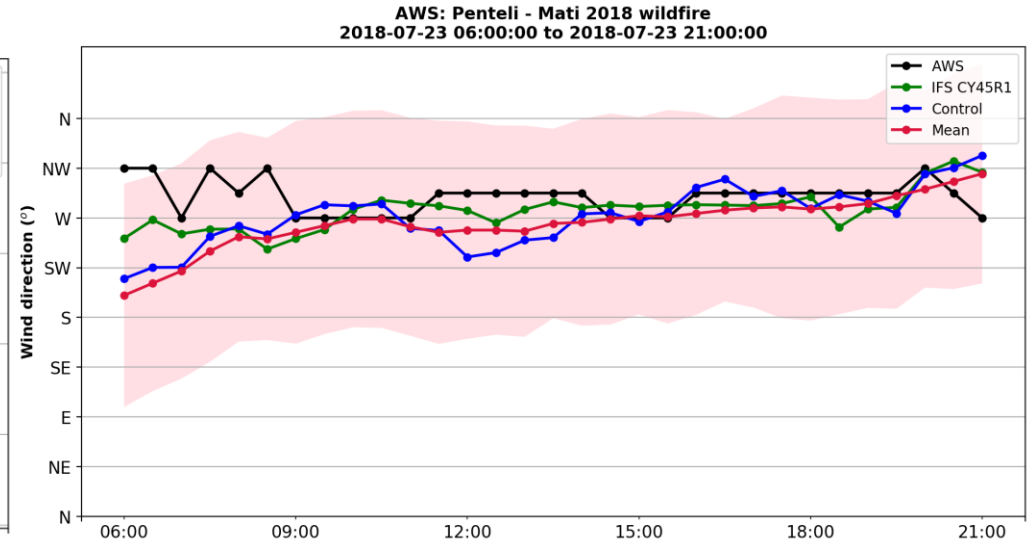
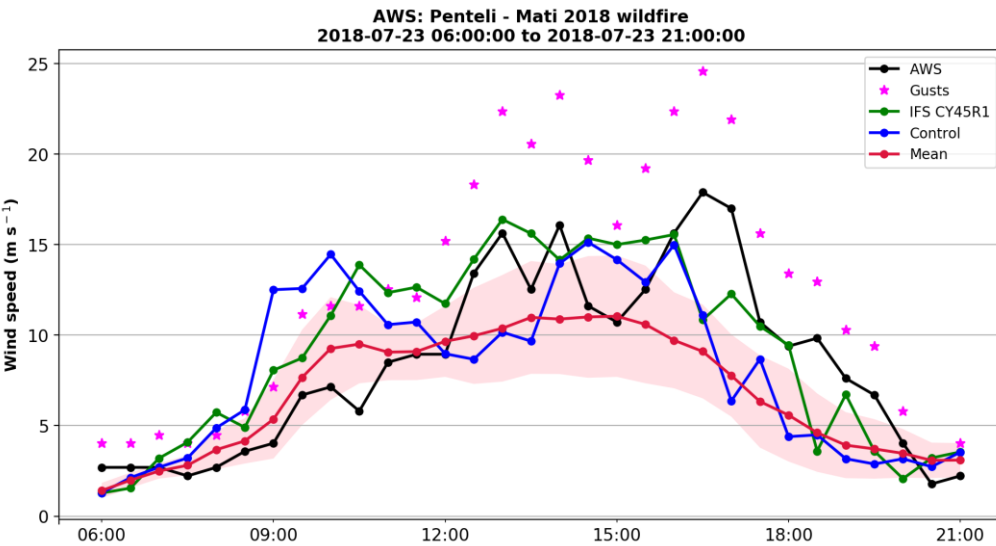
Green (contour): Deterministic | Blue (contour): Control

Valid: 23/07/2018 15:30Z

## Burn probability



EPS shows **larger lateral spread** along the **north flank** of the fire front, while it also **enhances the credibility** of the deterministic forecast.

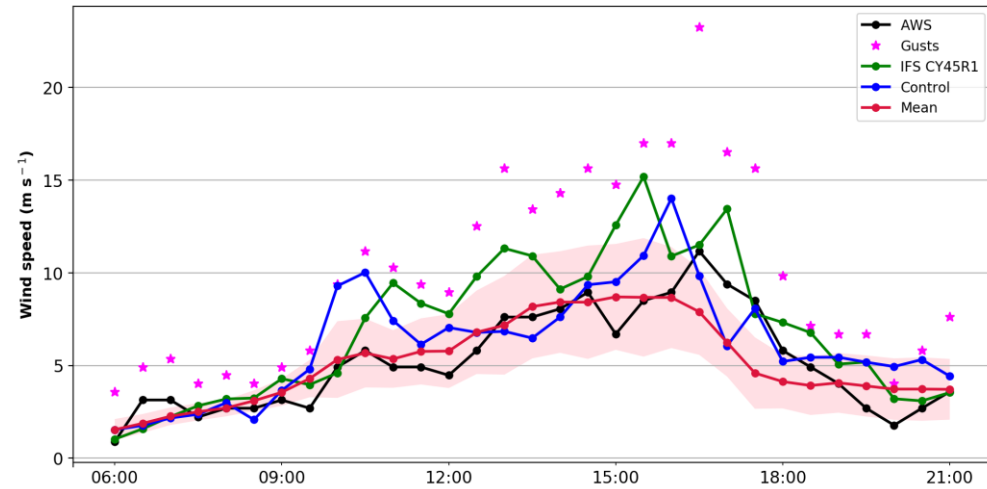


**CY45R1:  $3.3 \text{ m s}^{-1}$ ,  $27.3^\circ$**

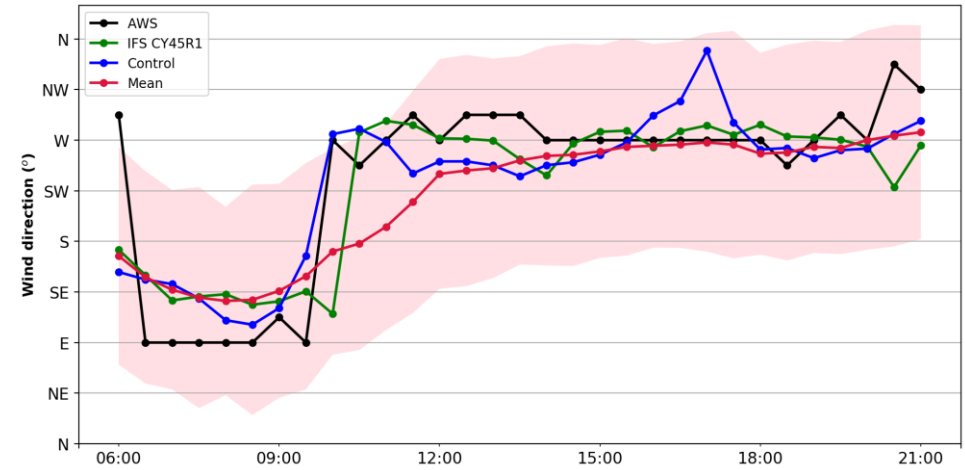
**EPS:  $3.5 \text{ m s}^{-1}$ ,  $39.2^\circ$**



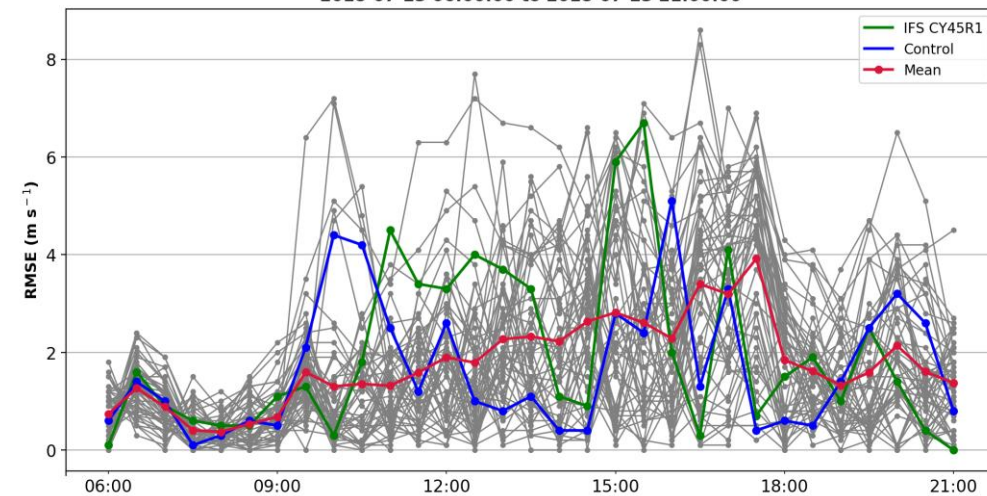
AWS: Rafina - Mati 2018 wildfire  
2018-07-23 06:00:00 to 2018-07-23 21:00:00



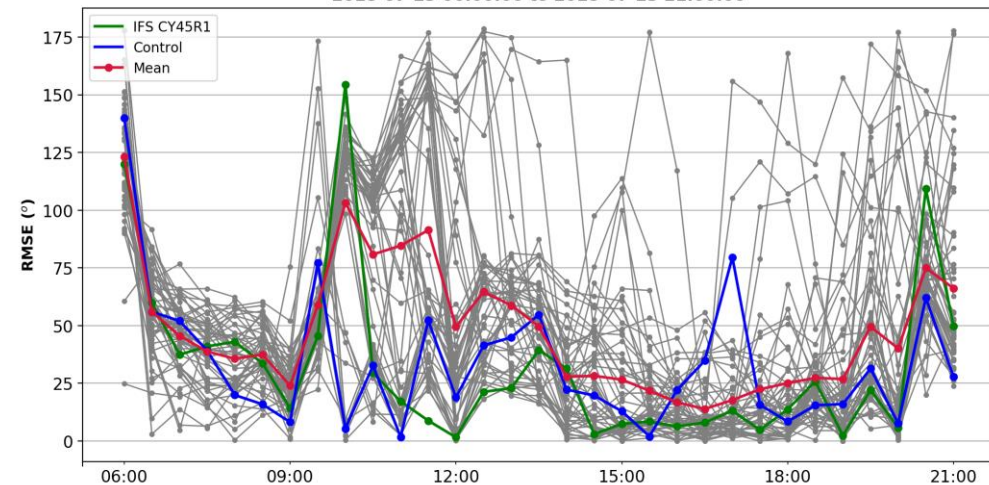
AWS: Rafina - Mati 2018 wildfire  
2018-07-23 06:00:00 to 2018-07-23 21:00:00



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2018-07-23 06:00:00 to 2018-07-23 21:00:00



AWS: Rafina - Mati 2018 wildfire  
2018-07-23 06:00:00 to 2018-07-23 21:00:00



**CY45R1:  $2.6 \text{ m s}^{-1}$ ,  $47.9^\circ$**

**EPS:  $1.4 \text{ m s}^{-1}$ ,  $47.8^\circ$**

Extreme Forecast Index  
for Model Gust Factors

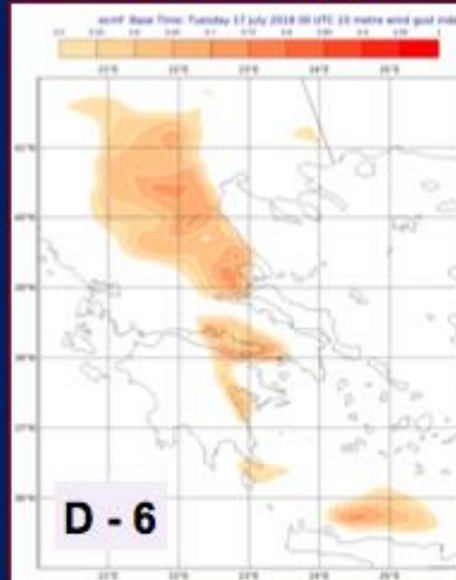
Reference (D) Day  
23 July 2018

Values greater than +0.5

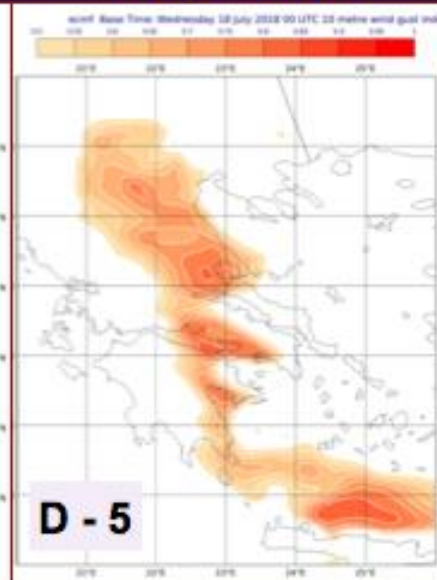
First alarm bells six days  
prior the event

Saturated values of GF  
as approaching D day

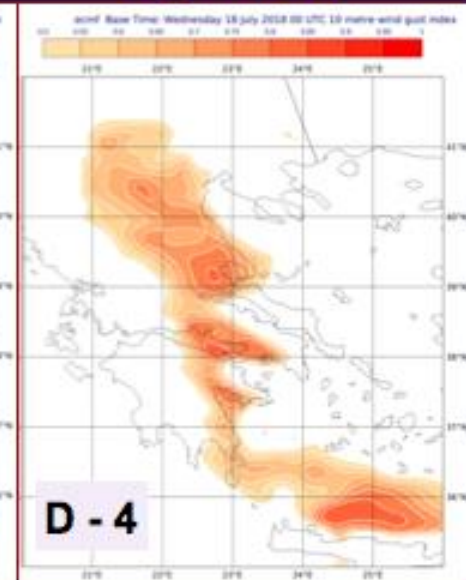
T144 – T168



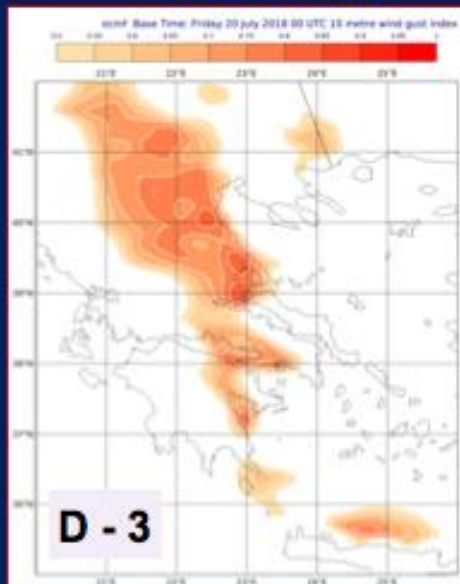
T120 – T144



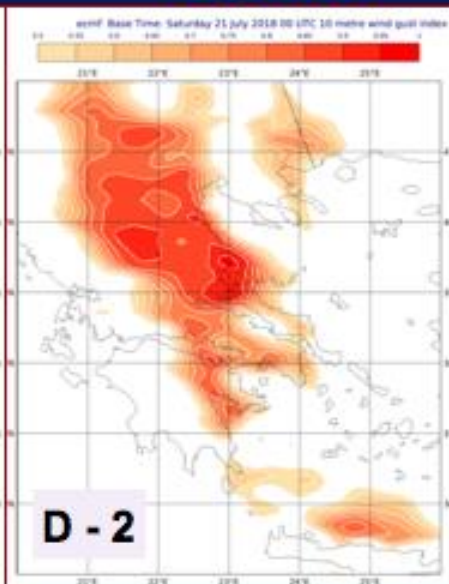
T96 – T120



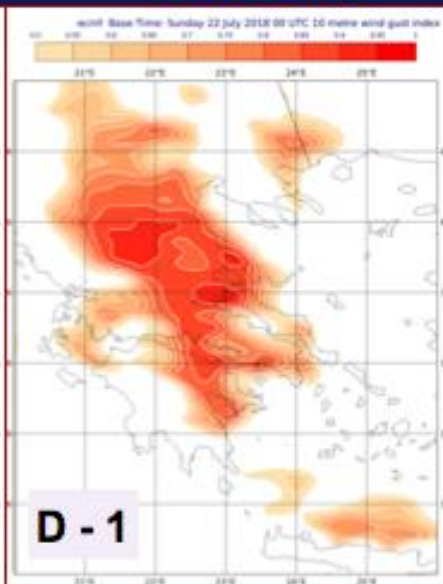
T72 - T96



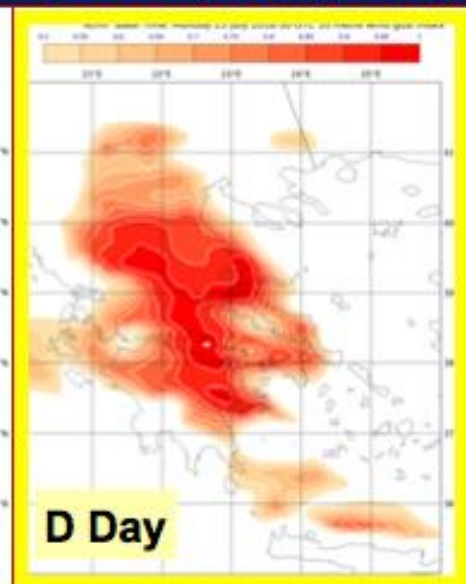
T48 - T72



T24 - T48



T0 - T24 (23 July 2018)



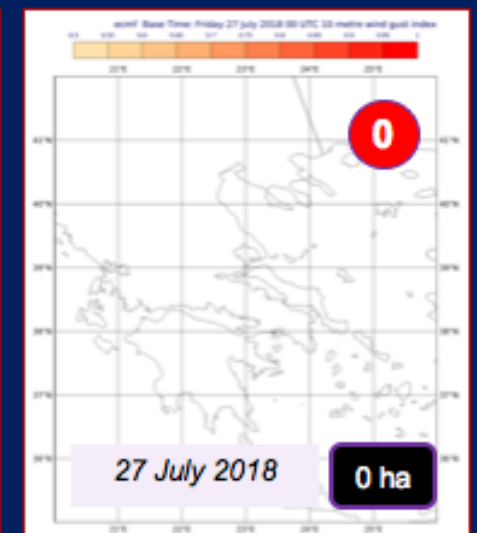
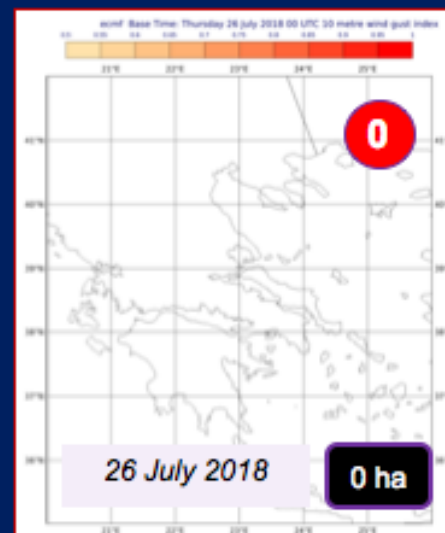
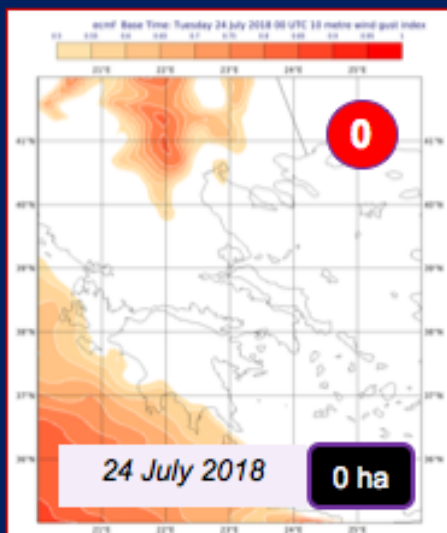
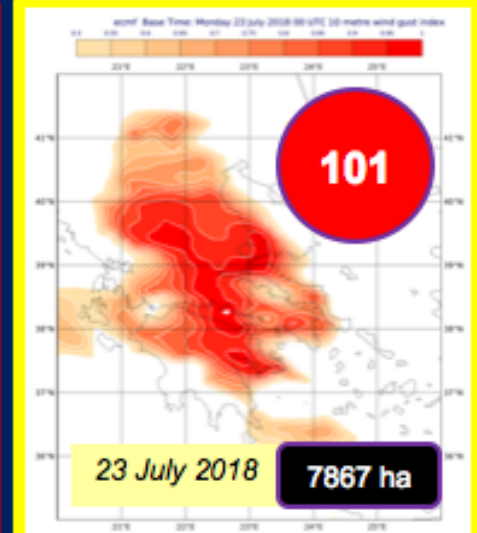
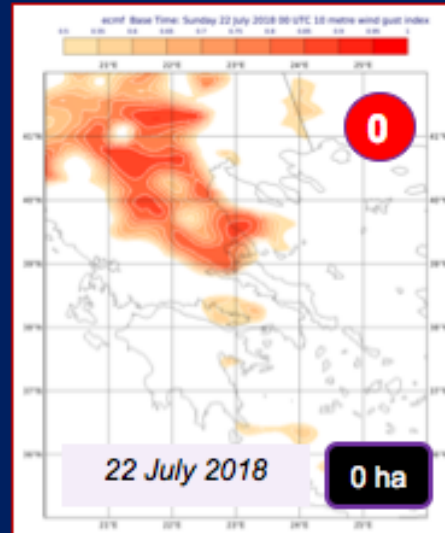
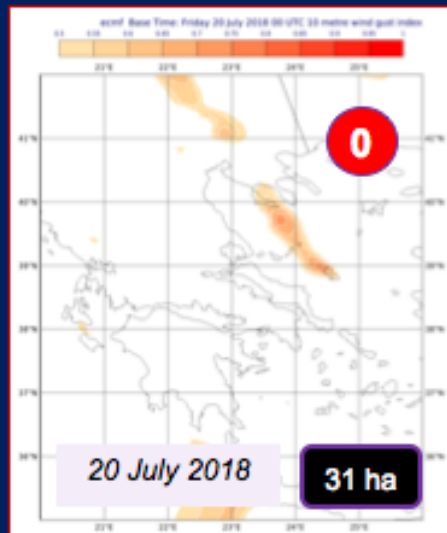


**Extreme Forecast Index (EFI) T0-T24 Values (based on 00utc model run) of ECMWF EPS for **Gust Factors (GF)** of winds at 10-meter height that could be available to Fire Managers during morning hours for assessing the anticipated gusty behaviour of atmosphere flow**

*No. of Fatalities*



*Burned Area*



# Summary - Conclusions - Future work

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The coupled fire-atmosphere **IRIS** forecasting system was used for retrospectively forecasting the deadly Mati wildfire, driven by **ECMWF deterministic** and **EPS** data.

**Preliminary results** show that:

- The deterministic forecast outperformed EPS at both lead times: T0+48, T0+24.
- At T0+48, the EPS guidance is misleading (NE movement of fire front).
- At T0+24, the EPS is in line with the deterministic forecast, enhancing credibility.
- Extreme forecast index for gust factors could be used for early warning.

**Overall**, the present study shows **no significant added-value** provided by the use of EPS for driving a **fire spread** forecasting system. This is particularly true, considering the computational cost for running the probabilistic fire spread forecasts.

Preliminary results should be revisited by **expanding** the current study:

- **More wildfires**, covering a wide range of meteorological/fuel conditions.
- **Include fire ignition location uncertainty** in the ensemble forecasting.



**Thank you for attention!**

**thgian@noa.gr**

