



Article

# Multi-Sensor Data Analysis of an Intense Weather Event: The July 2021 Lake Como Case Study

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Abstract: A comprehensive analysis of the July 2021 event that occurred on Lake Como (Italy), during which heavy hailstorms and floods affected the surroundings of Lake, is presented. The study provides a detailed analysis of the event using different observation sources currently available. The employed techniques include both conventional (rain gauges, radar, atmospheric sounding) and non-conventional (satellite-based Earth observation products, GNSS, and lightning detection network) observations for hydro-meteorological analysis. The study is split in three main topics: event description by satellite-based observations; long-term analysis by the ERA5 model and ASCAT soil water index; and short-term analysis by lightning data, GNSS delays and radar-VIL. The added value of the work is the near-real-time analysis of some of the datasets used, which opens up the potential for use in alerting systems, showing considerable application possibilities in NWP modeling, where it can also be useful for the implementation of early warning systems. The results highlight the validity of the different techniques and the consistency among the observations. This result, therefore, leads to the conclusion that a joint use of the innovative techniques with the operational ones can bring reliability in the description of events.

Keywords: meteorology; multi-instrumental analysis; extreme rainfall; flooding



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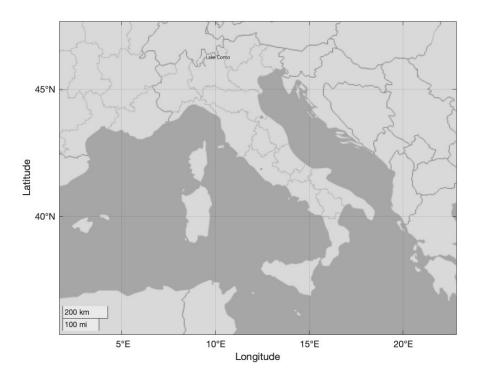
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# 1. Introduction

As the IPCC AR6 report [1] points out, since 1950, climate change has been affecting many weather and climate extremes, and in most of the world, the frequency and intensity of intense precipitation events have increased, with an associated non-negligible impact on population, structures, and infrastructure [2]. The loss-relevant natural disasters worldwide, mainly associated with weather events (e.g., storms and floods), increased about three times in the past 35 years; in this context, changes in the atmosphere, which include a widespread increase in water vapor content in the lower air layers [3], are playing a relevant role [4]. Interesting considerations about the spatial and temporal evolution of intense weather phenomena, including evaluating possible future scenarios [3,5], can be found in the scientific literature. Statistical analyses reveal that the situation is constantly evolving and that heavy weather events are increasingly observed even in the mid-latitudes. Examples related to this are the severe thunderstorms associated with large hailstorms and damaging convective winds [3,6] in several European regions [7–17], medicanes, i.e., Mediterranean tropical-like cyclones [18–22], and heavy rainfalls [23–27] with the resulting floods, which show significant trends over Europe [28,29]. The occurrence of these events is closely linked to climate change, and these phenomena make the Mediterranean one of the most sensitive regions to the problem [20,21], and consequently an interesting field of study for

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meteorology in Europe [7]. It is clear that the determination of descriptive and predictive algorithms for the atmospheric behavior [14,30–36] is crucial in an area such as Europe, which is strongly affected by severe weather phenomena. Additionally, Alpine lakes and their changes are key indicators of climate change and climate variability, and are useful to understand climate change impacts [37]. The above overview allowed the determination of some areas of interest and in particular, the areas of Northern Italy and the Alps are among the areas characterized by a higher trend in relation to the frequency of extreme events. The evaluation of climatology from ERA5 dataset allowed to identify the Lake Como area (lat: 43.5° N–48.5° N; lon: 6.8° E–11.8° E—Figure 1) as an interesting hotspot.



**Figure 1.** Lake Como position.

In addition to this, a further evaluation on the climatology of satellite soil moisture in the area, for the period 2007–2020, was carried out. Results clearly indicate the anomalous wet conditions occurred in the area around Como at the end of July 2021 (Figure 2—red line) also with respect to other years (Figure 2—grey lines). The Soil Water Index is indeed about 20% higher than the seasonal average calculated over 14 years of data.

To support the climatological findings, a shorter-term analysis on meteorological stations located in the area was also conducted. In Figure 3, the sum of the total number of extreme events [38], for the 3 year period 2016–2018, for each meteorological station, is given. The extremes are selected according to the 95th percentile of the rain events collected by the weather stations shown in Figure 3 in the period 2010–2020. A plot was generated showing the total seasonal rainfall and the number of extreme events, for the period between 2014 and 2020 plus the last week of July 2021 (Figure 4); as can be seen, in the five days in which the selected case study occurred, the number of extremes is already comparable to the number of an entire season.

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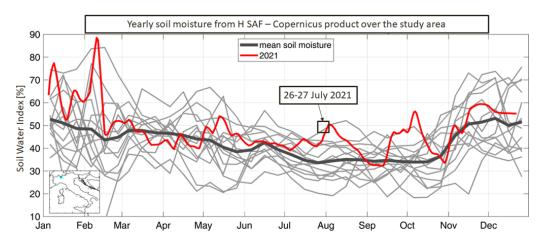
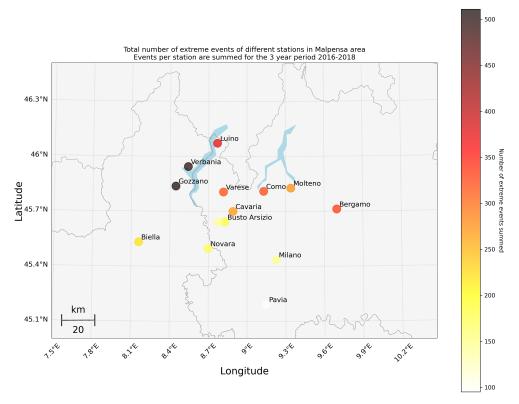


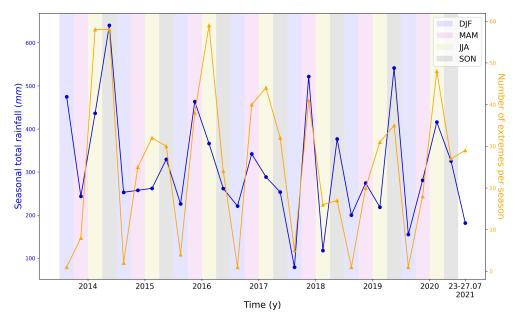
Figure 2. Soil moisture (ASCAT Soil Water Index).



**Figure 3.** Total number of extreme events for the 3 years period 2016–2018, for each meteorological station.

The summer of 2021, indeed, in the northern regions of Italy was characterized by several unstable episodes with strong thunderstorm activity that lasted for most of the period with some very intense thunderstorms, especially in the last week of July 2021. Particularly severe weather phenomena were recorded in the period between 24 and 28 July 2021, within Lombardy. The effects of these meteoric contributions on surface runoff have been most critical in mountain and foothill basins. Moderate and sometimes high critical situations, associated with flash floods generated along the affected hydrographic network, have been reported quite frequently in these areas.

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**Figure 4.** Total seasonal rainfall and the number of extreme events, for the period between 2014 and 2020 plus the 5 days of interest of 2021. DJF, MAM, JJA, and SON correspond to the initials of the 12 months of the year: December January February (DJF), March April May (MAM), June July August (JJA), and September October November (SON).

These phenomena are occurring with increasing frequency and often lead to emergency situations in the affected areas. In this context, the state of the art highlights the need to integrate new techniques that can provide additional information to event analysis.

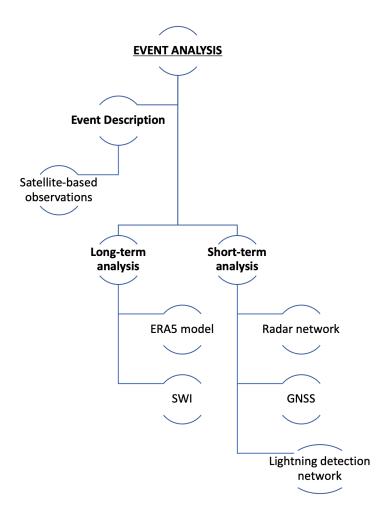
The given overview prompted the selection of the Como event of July 2021 as being of interest for multi-sensor approach test analysis. In this study, we performed an observational study of the Lake Como (Italy) event occurred in July 2021, considering an area centered on the Como GNSS receiver position (latitude = 45.80217; longitude = 9.09563). The event, characterized by a significant impact on the ground in terms of damage and inconvenience [39], turns out to be particularly interesting in the comparative study by different analysis techniques. The study offers the opportunity to investigate the applicability and consistency of the techniques used and to understand the potential of each type of observation and the possibility of integrating all available information into the analytical phase of this type of meteorological event.

# 2. Material and Methods

A multi-sensor approach to investigate severe weather conditions [40] is an effective method to analyze the event from different points of view, such as meteorological, hydrological, and even phenomenological. For this purpose, the event was analyzed using both conventional and non-conventional observations (rain gauges [41], atmospheric sounding [42], radar [43,44], satellite-based Earth observation products [45], GNSS [46], and lightning detection network [16,47]). Some techniques were applied for descriptive purposes, others for more strictly analytical purposes. However, the overall aim remains that of assessing the organic use of the various techniques in order to produce a comprehensive analysis of the event under consideration. With reference to the conceptual map shown in Figure 5, the analysis of the event was conducted organically using satellite data (SEVIRI-MSG, and H SAF products) to describe the event, climatological data (ERA5 and SWI) for a long-term preliminary analysis of the area, and radar, lightning and GNSS data for short-term analysis.

In this section, for the sake of clarity, the different techniques applied are briefly described.

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**Figure 5.** Concept map of applied methodologies.

#### 2.1. Satellite-Based Earth Observation Products

Meteosat satellites currently operate over Europe, Africa and the Indian Ocean, in geostationary orbit above the equator. The Meteosat Second Generation (MSG) system is set up in cooperation between EUMETSAT and ESA and ensures the continuity of observations after Meteosat First Generation. MSG is equipped with the SEVIRI (Spinning Enhanced Visible and Infrared Imager) sensor which allows the acquisition in 12 channels (two in visible 0.6 and 0.8 μm; one in NIR 1.6 μm; eight channels in IR 3.9, 6.2, 7.3, 8.7, 9.7, 10.8, 12.0, and 13.4 µm; and the last visible in high-resolution HRV) on a continuous loop. Each cycle takes 15 min to acquire the entire full disk (12 min for acquisition and the remaining for calibration) from the southern hemisphere to the northern hemisphere. There is also a second operational scan called rapid scan service (RSS) that acquires data every 5 min over the European area and part of North Africa. Channel resolution is 3 km (1 km for HRV). The raw data acquired by the Meteosat are collected by the EUMETSAT control center and from there are pre-processed and redistributed via satellite (EUMETCast). During this phase, some possible imperfections of instrumental origin are substantially corrected, and the geometric distortion is improved toward a standard projection [48]. In this work, appropriate channel analyses (Table 1), illustrated in the following sections, were performed [49].

In the frame of the Satellite Application Facility on Support to Operational Hydrology and Water Management (H SAF), the P-IN-SEVIRI-PMW (H60; Precipitation rate at ground by GEO/IR supported by LEO/MW) product was employed for precipitation analysis.

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Trend and Channel Differences	Physical Process
Ch9 (10.8 µm) trend	Updraft intensity
Ch5-Ch6 (6.2-7.3 µm)	Cloud thickness
Ch7-Ch9 (8.7-10.8 μm)	Presence of ice at the top of the cloud

**Table 1.** Useful channels for cloud development analysis.

P-IN-SEVIRI-PMW is an operational product based on infrared (IR) images from the SEVIRI instrument on-board MSG satellites blended with all the available precipitation micro-wave estimates (PMW).

The spatial coverage of P-IN-SEVIRI-PMW includes the H SAF area (Europe and Mediterranean basin), Africa and Southern Atlantic Ocean. The product is provided on the MSG SEVIRI grid, at the 15 min imaging rate of SEVIRI, and the spatial resolution is consistent with the SEVIRI pixel (3 km at nadir).

The processing method adopted for the product is called "rapid update" (RU). Following this technique, the precipitation estimates are obtained by combining IR GEO equivalent blackbody temperatures (TB) at 10.8 µm with rain rates (RR) from PMW measurements.

#### 2.2. ERA5 Model

Italy has a large and dense coverage of meteorological sensors, yet its use aimed at a long-term climatological study is rather cumbersome. For this reason, in order to define a climatology, a statistical analysis on the ERA5 (fifth generation of meteorological reanalyses issued by ECMWF (European Centre for Medium-Range Weather Forecasts)) dataset [50] for the period 1980–2020 was performed. The reanalyses combine the integrated forecasting system (IFS) model background field with observations to achieve the best estimate of the atmosphere. The ERA5 employed model, covering the whole Earth, uses 137 layers to resolve the atmosphere in the vertical direction and has a horizontal resolution of about 30 km. The ERA5 dataset includes hourly estimates of a wide range of variables, and in the frame of this research, we have employed the following parameters:

- Total column water vapor (tcwv) [kg m²], which represents the total amount of water vapor in a column extending from the surface of the Earth to the top of the atmosphere (i.e., the area averaged value for a grid box) [50].
- Total precipitation (tp) [m], which is the accumulated liquid and frozen water, comprising rain and snow, that falls to the Earth's surface. It is the sum of large-scale precipitation and convective precipitation. Large-scale precipitation is generated by the cloud scheme in the ECMWF-IFS. Convective precipitation is generated by the convection scheme in the IFS, which represents convection at spatial scales smaller than the grid box [50].

#### 2.3. Soil Water Index

Satellite soil moisture observations are retrieved from the Copernicus Land Monitoring Service that provides the Soil Water Index (SWI) obtained from the EUMETSAT advanced scatterometer (ASCAT) soil moisture starting from January 2007 to now. The ASCAT SWI product is available with a spatial resolution of 10 km and a daily temporal resolution (data are representative of 12:00 local time).

# 2.4. Radar Network

The Italian weather radar network is currently composed of 24 systems, including 20 C-band and 4 mobile X-band systems, the latter being mainly used as gap fillers. About 75% of the network is composed by radars with dual-polarization capabilities. The northern part of the country benefits from a rather good observational coverage, especially in the Po river basin, where the minimum number of overlapping radars is two on the western side, reaching 5 or more in the eastern sectors.

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# 2.5. GNSS and Atmospheric Sounding

Dry air and water vapor molecules in the troposphere affect GNSS (global navigation satellite system) signals by lowering their propagation velocities [51]; this effect, if properly analyzed, can provide useful information for atmosphere sensing [52]. The extensive presence of GNSS sensors in Italy and the availability of their data represent a strong basis for the usage of this technique for meteorological applications. Considering the advantages provided by GNSS post-processed data reported in the scientific literature for various meteorological analyses [32,36,53–57], the transition to NRT (near real-time) GNSS meteorology operational systems [46] is crucial for providing information useful to predict rapidly evolving weather events [58–60]. Capturing atmospheric water vapor with high spatio-temporal resolution [59], GNSS-NRT data can be extremely helpful in the case of early warning systems related to severe weather events, in order to mitigate risk by providing timely warning of the hazard and thus giving useful information to limit damages.

The data management methodology described here is only applied to the global positioning system (GPS) constellation data, for reasons of real-time data availability, applying the PPP (precise point positioning) processing technique using the Breva software. Breva is a GNSS data-processing suite developed by GReD using the goGPS software [61] as its core processing engine. The processing parameters used for this near real-time solution can be seen in Table 2.

Data sample rate	30 s
Orbits and clocks	IGS-RTS
Ocean loading model	FES2004
Ionospheric a priori model	CODE predicted 1 day ahead
Tropospheric MF	VMF3 1 $\times$ 1 forecasts
Gradients MF	Chen and Herring
A priori zenith delay	VMF gridded zenith delays
Meteorological data	GPT
ZTD parameter modeling	Cubic splines every 5 min
Gradient modeling	Cubic splines every 30 min
Cut-off angle	7 degrees
Min SNR threshold	25 dBHz
Min arc length	300 s
Observation weighting	Uniform
Parameters export rate	5 min

**Table 2.** Processing parameters used for the GNSS near-real time solution.

The area of interest is covered by 12 dual-frequency GNSS receivers and, in order to demonstrate the validity of the data obtained from them, validation was carried out by radiosonde, using a procedure already used in the past for post-processed data [36].

The comparison was performed among punctual ZTD (Zenith Total Delay) values derived from sondes released at the launch point of the Radiosonde 16064 LIMN Novara Cameri and the ZTD estimated by processing the closer GNSS station NOVR. The target period was from 23 July to 30 July 2021. RAOB data were collected every 12 h, whereas GNSS outputs had a time step of 5 min. The results of the ZTD comparison show great consistency between the data, with a favorable [42] difference analysis: Mean = 0.2 cm and standard deviation = 1.0 cm, which provides an encouraging feedback on the dataset obtained through the NRT processing outlined above. In this study, GNSS data are employed in different comparisons, both in terms of IWV (estimate of the integrated water vapor over-

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lying the receiver [52], obtained by mapping function from observations on the different satellites lines of sight) and PWV (precipitable water vapor, obtained dividing the value of IWV by the water density [46]). These quantities [46,52] were computed from GNSS-NRT data using the meteorological parameters from global pressure/temperature (GPT) model (a global empirical model providing an approximation of meteorological parameters) [62]. In this work, we had no real-time data available from weather stations; therefore, we preferred to rely on the GPT model. The above model, in similar circumstances and in the absence of observed data, provided reliable results in the past [47]; however, we point out that if there is the availability of more accurate data, it is certainly appropriate to refer to those, avoiding problems that might occur in the analysis of severe weather events.

# 2.6. Lightning Detection Network

Lightning data used in this paper are provided by the Lightning Detection Network (LINET) [63,64]. The LINET is a ground network which counts more than 500 sensors worldwide, more than 200 of which are located in Europe, with a higher density over Central Europe and Western Mediterranean (from 10° W to 35° E and from 30° N to 60° N). LINET measures the total lightning, i.e., both intra-cloud (IC) and cloud-to-ground (CG) discharges. Data processing is performed through a 3D procedure called time-of-arrival (TOA) [64]. This 3D algorithm consists of three phases: flash 2D location through TOA, exploitation of the time delay at the sensor nearest to the lightning, and time relaxation of the travel path of the radio wave. Following this procedure, two pieces of information can be obtained. First, it is possible to distinguish between IC and CG discharges and second, the flash height can be calculated for IC flashes. LINET sensors provide, for each discharge, the following data: date and time of occurrence, latitude, longitude, type of discharge (IC or CG), lightning amperage and height (for IC discharges). In this work, lightning data over the Italian territory are used, and all discharges recorded in 1 s and in a 10 km radius are considered as a single flash [65].

#### 3. Results

A mostly stable phase over central Mediterranean area has persisted since the beginning of June, with short-lived inflows of cooler air at high altitudes, especially over the northern regions. After this, in the last week of July, a deep depression area has positioned between France and the United Kingdom, causing a lowering of the jet stream at latitudes even below the Alpine area and over the Po Valley.

This situation persisted until the end of the month, with an acute phase between 26 and 28 of July 2021. On 25 July 2021, a southwesterly flow, derived from a deep Atlantic tough extending from the North Sea to the Iberian Peninsula, was observed over the northern regions of Italy. This configuration, facilitated by the arrival of colder air in the middle and upper troposphere, resulted in the development of intense thunderstorm cells over Northern Italy, including supercells in the lowlands. The effect of the intense updrafts, with high vertical shear, is accentuated in this event by the intense jet stream at high level, with a direction from south-west to north-east right across the Po Valley.

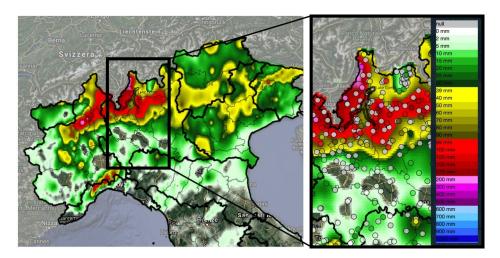
In the morning of 27 July 2021, the deep Atlantic tough approached further the northern regions, again causing the development of intense thunderstorm cells, following a south-west to north-east direction, with a slow eastward movement.

The thunderstorms developing over Northern Italy determined a considerable rainfall over the area well-detectable by both the Italian rain gauge network and the satellite-based Earth observation products. Specifically, the H SAF P-IN-SEVIRI-PMW product was employed to evaluate the accumulated rainfall, and it showed good accordance with radar—SRT1 (Surface Rainfall Total) adjusted data. This agreement encourages the joint use of different platforms, future multi-instrumental applications and potential use of the H SAF product for the analysis of events in areas not covered by radar.

Figure 6 shows the rain map downloaded from the MyDewetra platform [66]. The map provided by this platform is produced using the Random Generator of Spatial Interpolation

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from uncertain Observations (GRISO) [67,68], which obtains spatially continuous rainfall maps (over  $5 \times 5$  km grid) from individual gauge measurements, and is given for the whole period of interest (5 full days between 24 July 2021 at 00:00 UTC and 28 July 2021 at 23:55 UTC).



**Figure 6.** Rain map (**left panel**) and rain gauges overlapped to rain map (**right panel**) focused on the area of interest (blue square identifies Lake Como)—accumulated rainfall over the whole period from 24 July 2021 at 00:00 UTC to 28 July 2021 at 23:55 UTC [66].

Specifically, the severe weather caused great inconveniences and damages everywhere in Como city and its province.

The Lariana road was completely blocked in several points due to debris, flooding and landslides caused by overflowing torrents. No injuries were recorded but the damages and inconveniences were considerable.

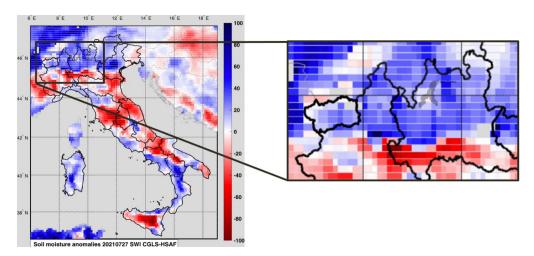
Significant disruptions were also found in the Como center, where some streets were flooded. A long-term analysis, on the whole area in the period 1980–2020, was carried out by ERA5 data. The analysis was performed on the whole area over the period 1980–2020. The value corresponding to the 90th percentile of total precipitation and total column water vapor ERA5 parameters was computed and used as a threshold to assess how many times this value was exceeded in each pixel. The linear trend in the period 1980–2020 was computed, pixel by pixel, and normalized [69] according to the maximum value of the entire area. This kind of analysis allowed to assess how, over a period of 40 years, there has been an increasing rate of threshold exceedences in the area affected by the event, particularly in the northern part of Lake Como (see supplementary material).

Hence, the identification of the area as increasingly exposed to intense events and therefore of interest for the study. An analysis of soil moisture during the days before, and a day after, the main hydrological event was also conducted in order to better understand the soil condition which led to the phenomena.

By considering the ASCAT SWI product, the seasonal anomalies were computed for each day of the year (i.e., the difference between the current soil moisture conditions and the monthly climatology of each pixel).

During the whole period, the soil moisture conditions in the investigated area were wetter than normal, and in the days of 27 and 28 July, very wet conditions were achieved (close to saturation). Specifically, by looking at Figure 7, showing a zoom over the investigated area, it is evident the occurrence of very wet conditions at the borders between Italy and canton of Ticino (north of Como city). These wet conditions together with the significant rainfall amounts were the main factors causing the large impact of the event over the territory. One of the most significant events that occurred during the period analyzed is the heavy hailstorm recorded in the afternoon of 25 July. For this specific event, a short-term analysis was performed using data from the lightning network, radar and GNSS.

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**Figure 7.** Zoom of soil moisture anomaly map (ASCAT Soil Water Index from Copernicus and EUMETSAT) for 27 July 2021.

# Short-Term Analysis

Based on the observations provided by the dual-polarization weather radar sited in Turin, far by about 145 km from the storm core, the event most intense phase was observed on July 25th, between 14:00 and 15:00 UTC. Despite the distance, the detected echo was rather intense. Indeed, looking at the storm time evolution in terms of the maximum intensity along the vertical, the reflectivity (dBz) mostly exceeded 55 dBz, with a maximum of about 65 dBz. The time sequence of the estimated vertically integrated liquid (VIL) content (expressed in  $kg/m^{-2}$ ) between 14:00 and 14:40 UTC of the 25 July 2021, allows to argue that the Como area has been affected by a large-sized hail bearing storm and, according with the empirical linear relation linking the maximum hail size to the VIL  $(kg m^{-2})$  in the range 45–70 kg m<sup>2</sup> proposed by [70], extrapolated as in [71] to higher values, we estimated that the hail size likely exceeded 10 cm. Given these premises, the analysis was performed focusing on the time period between 10 a.m. and 8 p.m. on 25 July 2021. The study was made assessing organically MSG SEVIRI data at 15 min (Ch9 black line in Figure 8, Ch7-Ch9 cyan line in Figure 8 and Ch5-Ch6 purple line in Figure 8 (Table 1)), lightning data from LINET network with a time span at 10 min (green line in Figure 8), radar-VIL data at 10 min and PWV [46,52] also at 10 min.

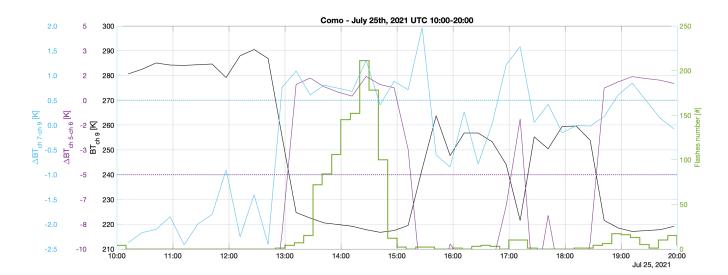
As plotted in the Figure 8, the lightning data show a high electrical activity over Como between 1.00 p.m. and 3.00 p.m., with maximum values more than 200 str/10 min.

With reference to this event, an analysis of brightness temperatures from SEVIRI MSG was carried out. The brightness temperature (BT) of the IR channels was computed as the median value over the  $3 \times 3$  pixels around the grid point on Como (lat = 45.80217; lon = 9.09563). Channel 9 (black line in Figure 8), which estimates the cloud top temperature, highlights a decrease of the cloud temperature (vertical growth) just before 1.00 p.m., a few minutes before the beginning of the lightning strike, when it goes from 285 K to 225 K in 30 min. At 2.57 p.m., it reaches the minimum BT value (around 220 K) corresponding with the maximum lightning strike.

The difference between channels 7 and 9 (cyan line in Figure 8) identifies the presence of ice at the top of the cloud when the value exceeds 0.5 K (horizontal cyan line in Figure 8). This happens around 13:00; actually, it is evident between 13:00 and 15:00 when lightning strikes also reach the maximum values.

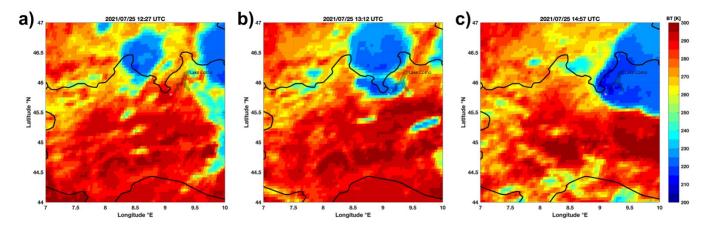
The difference between channels 5 and 6 (purple line in Figure 8) identifies a high cloud thickness if the difference exceeds -5 K (horizontal purple line in Figure 8), which is apparent between 1 and 3 p.m.

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**Figure 8.** Analysis of the most intense part of the event, between 10 a.m. and 8 p.m. on 25 July 2021. MSG SEVIRI data (cloud top temperature—[Ch9] black line, presence of ice at the top of the cloud—[Ch7-Ch9] cyan line and cloud thickness—[Ch5-Ch6] purple line (Table 1)) and lightning data from LINET network (green line).

A qualitative analysis of satellite images allows to notice the evolution of the thundercloud that involved the Como area and evolved in a V-shape thundercloud. The cloud originally developed to the west of Lake Como, over Southern Switzerland near the Italian border and moved east-south/eastward over the next 2.5 h, involving the Como area between 1 and 3 p.m. (Figure 9).



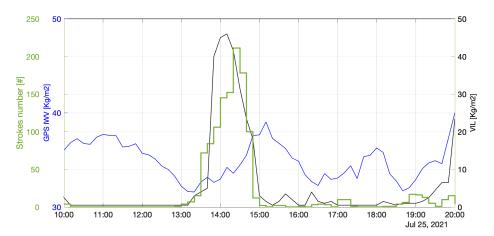
**Figure 9.** The panels (a) 12:27, (b) 13:12 and (c) 14:57 UTC) represent acquisitions in the IR channel from the SEVIRI sensor on board MSG cropped over the area of interest.

Figure 9 shows 3 panels, (a) 12:27, (b) 13:12 and (c) 14:57 UTC), representing acquisitions in the 10.8 micron channel from the SEVIRI sensor on board MSG cropped over the area of interest (Como coordinates: lat = 45.80217; lon = 9.09563). The panels show, respectively, (a) the instant just before the arrival of the convective cloud over Lake Como; (b) the instant in which the storm cell reaches the area of interest, which is the beginning of the event on the Como area; and (c) the moment in which the minimum of the BT (217 K), i.e., the maximum of the convective development of the cloud, is reached in Como. This instant is the closest to the maximum of lightning as shown in Figure 8. The color scale in the figure indicates the cloud top BT and ranges from blue (200 K) to red (300 K). Shades of blue (BT  $\leq$  240 K) indicate the presence of clouds with a gradually increasing altitude

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as the BT decreases. More intense blue tones indicate a colder cloud top and, generally, greater severity of the storm cloud.

The analysis of radar data and, especially, VIL allows the evolution of the main convective cell to be monitored. As shown in Figure 10, lightning is well-correlated (correlation coefficient = 0.85) with VIL and tends to follow its trend temporally. GNSS observation also shows a good ability to track the event; however, as can be seen from Figure 10, the peak recorded by the GNSS data does not coincide with the maximum provided by the lightning data. Making a test calculating the VIL median over a gradually increasing area (from a radius of about 10 km to a radius of almost 30 km), a closer approximation of the VIL to the GNSS dataset trend is noticed; indeed, increasing the size of the box where the median is calculated, the peak of VIL is smoothed and shifted in time in the direction of the maximum value recorded by the GNSS data (see supplementary material). This suggests that the delay in the GNSS observation is related to the geometry of the observation which, in the case of these receivers, is inclusive of the observations collected within a radius of view greater than the 10 km that characterizes the other observations shown in Figure 10.



**Figure 10.** The picture shows a comparison between the VIL-radar parameter (black line), obtained by calculating the median over an area with a radius of about 10 km and centered on Como GNSS receiver, the IWV (blue line) obtained from GNSS observations and the lightning number (green line) also over an area with a radius of about 10 km, centered on Como GNSS receiver.

#### 4. Discussion

The comprehensive analysis of the intense weather event that occurred in July 2021 in the Lake Como surrounding areas has highlighted many features under different points of view. The introductory description of the event was provided resorting to the data by operative tools [66,72,73] mainly used in Italian DPC. The climatological analysis, carried out in terms of different parameters (TCWV and TP by ERA5 [50] and Soil Water index), highlighted how the area of interest can be considered a hotspot when it comes to exposure and vulnerability to severe weather events and supported the author in the definition of event exceptionality. First, the event was studied in terms of SWI because the antecedent conditions underline how the wet ground together with the significant rainfall amounts were the main factors causing the large impact of the event over the territory. In particular, at the end of July 2021, SWI is indeed about 20% higher than the seasonal average calculated over 14 years of data; anomalous wet conditions occurred also in February and October 2021. However, they were not followed by heavy rainfall, and therefore no significant impact was observed on the ground in those cases.

The event analysis enables the strengths and weaknesses of different observational techniques to be highlighted. The observations provided by a dual-polarization weather radar, shows that the Como area was affected by a large-sized hail bearing storm between 14:00 and 14:40 UTC on 25 July 2021. The analysis of radar data and, especially, VIL

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allows the evolution of the main convective cell to be monitored with excellent spatial and temporal accuracy and represents the best observation, when it is available, to follow this type of event.

Lightning is well-correlated (correlation coefficient = 0.85) with VIL and tends to follow its trend temporally, due to the fact that cloud electrification processes take time to produce lightning from the genesis of convective processes.

GNSS observation also shows a good ability to track the event; however, as can be seen from Figure 10, the peak recorded by the GNSS data does not coincide with the maximum provided by the lightning data. Throughout other studies [16], a non-replicative behavior in the trend of GNSS data compared to lightning data was observed; this aspect can be traced back to the GNSS observation geometry, indeed GNSS data are inclusive of observations collected within a radius of view greater than the 10 km cut characterizing the other observations shown in Figure 10. This topic will be explored more in depth in future studies. Satellite measurements are of considerable utility, as they support the description of the event and show the evolution of the convective cell in space and time. The proposed analysis also proves to be suitable for providing both a large-scale and a local-scale snapshot of intense events, as previously tested [47,74]. The agreement between all the products involved in this study is evident and encourages the joint use of different platforms, future multi-instrumental applications and potential use of some products (e.g., satellite-based) for the analysis of events of interest in areas not covered by operative tools.

#### 5. Conclusions

The main aims of the study reported in this paper were to describe in the most complete and detailed way the intense meteorological event that occurred in the Lake Como surrounding areas in July 2021 and to show the agreement between the products involved in this study in order to evaluate the joint use of different platforms, future multi-instrumental applications and potential use of some products (e.g., satellite-based) for the analysis of events of interest in areas not covered by operative tools.

In particular, we started from a long-term and large-scale study concerning the climatology of the area, to a short-term and more local scale where we described the one of the most acute phases of the event, which occurred in the early afternoon of 25 July 2021 around Lake Como.

For the long-term analysis:

- ERA5 model data were employed and highlighted the increase in time of the threshold exceedance number of total precipitation and total column water vapor parameters in the area north of Lake Como.
- The analysis carried out on 14 years of ASCAT SWI product clearly indicates the exceptionality of the event by showing anomalous wet conditions at the end of July 2021.
  As for the case study:
- Satellite-based Earth observation products supported the description of the event and showed the evolution of the convective cell in space and time.

Moreover, the satellite-based Earth observation products are available even in areas covered by the sea, and the results are particularly fruitful in the case of events generated in areas far from the coast. For the short-term analysis of the event, data from different instruments were used, involving conventional and non-conventional techniques in order to conduct the study focusing on different phases and aspects. The data involved were from lightning network, radar and GNSS sensors:

 Lightning and radar data provided an overview of the most intense phase of the event, and the comparison with satellite-based data, from both SEVIRI-MSG and GNSS, made it possible to understand the potential and the role of these instruments in the event analysis.

It is useful to point out how the GNSS technique, while not developed for meteorological purposes, makes an interesting contribution to the analysis. Moreover, it is characterized

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by a strong spread of sensors over the territory and, therefore, the availability of data that can provide continuous information over time and are spatially distributed. The tools used, previously described in detail, showed, in the frame of the event analyzed, mutual consistency in the results, giving an overview of the event occurred. However, each instrument has its peculiarity, which highlights different aspects of the event; this is important for model verification, data assimilation in NWP models and observational nowcasting.

**Supplementary Materials:** The following supporting information can be downloaded at: https://www.mdpi.com/article/10.3390/w14233916/s1.

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Data Availability Statement: The soil moisture and precipitation satellite data that support the findings of this study are openly available by the H SAF project at <a href="http://h-saf.eumetsat.int">http://h-saf.eumetsat.int</a> (accessed on 10 October 2022) website address. MSG channel data are freely available by EUMETSAT at <a href="https://www.eumetsat.int/">https://www.eumetsat.int/</a> (accessed on 10 October 2022) The lightning data LINET are not freely available due to commercial restrictions; ISAC-CNR holds the access and management of the Italian data. Raingauge and radar data are subject to third party restrictions; DPC holds the access and management of the Italian data. The GNSS data belong to the SPIN network (Piedmont and Lombardy regions). Two GNSS receivers (GRTR and SNP1) belong to Geomatics Research & Development s.r.l.

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