

# Technical Memo



# 885

## Use and Verification of ECMWF products in Member and Co-operating States (2021)

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## Abstract

Every other summer Member and Co-operating States report on the application and verification of ECMWF's forecast products for the previous two years. ECMWF also gathers feedback in other fora throughout the year. This report summarises feedback collected between summer 2019 and summer 2021.

Usage of ECMWF forecast products remains widespread across National Met Services (NMSs), from short range through to seasonal timescales. Very favourable comments regarding outputs and accuracy are commonplace, notably for the short range and the medium range. There are again plenty of examples of forecasting success in severe weather situations, e.g. for wintry precipitation, but also some examples of events being missed. Flash flooding remains very challenging for models in general, with moisture budget terms in certain situations still hard to disentangle.

In the short range and early medium range ECMWF output is ordinarily used alongside the output of high resolution, limited area, convection-resolving models (LAMs) and ensembles. Activities here that have expanded since 2019 are the use of LAM ensembles, downscaling, and automated (and manual) blending techniques. Blending is designed to extract maximum benefit, and seamlessness, from modelling systems with different strengths. Post-processing (prior to any blending) is also commonplace, and there are again examples of simple approaches like bias correction delivering significant gains. Machine-learning (ML) is still just on the horizon for most NMSs, although Switzerland do already deliver some ML-based operational products. Switzerland are also running what appears to be the highest resolution LAM ensemble (1.1km).

National Met Services have again performed comparative verification for LAMs, HRES (ECMWF's 9km model) and ENS (ECMWF's 18km ensemble), notably for surface weather. The difference in spatial scale between LAMs and global models can affect verification results, and countries use a variety of approaches to account for this. Overall, using a neighbourhood approach and a combined index for precipitation and wind gust, France report AROME-FRANCE consistently outperforms the global HRES and ARPEGE models. Israel report their LAM ensemble to be clearly superior to ENS for all variables. More generally, relative to the IFS, LAMs have a clear advantage for 10m wind prediction, especially for mountains, and some advantages for 2m temperature. Problem areas for 2m temperature, for many models, are clear calm nights, hot sunny days, and springtime. The scale issues noted above are especially relevant for fields exhibiting high spatial variability, such as precipitation (and some other moisture-related variables). Nevertheless, even if not accounting for related 'double penalty' issues, the reports generally show that the LAMs also perform well for precipitation, while for low-level moisture variables results are less consistent, with IFS often performing better. Interestingly Belgium identified a multi-day drift in several surface weather variables in IFS forecasts for Belgian sites; we had some awareness of these but are now investigating further.

New and innovative NMS-designed diagnostics include fire ignition risk from Portugal, based on dry thunderstorm probability, hail predictors developed in Hungary, and stacked probability bar charts for visibility from The Netherlands. Services were very positive about ECMWF's "progressive" forecast products, such as precipitation type charts, ensemble vertical profiles and ecPoint output, but all manner of new requests continue to be lodged. The ecCharts tool was widely praised, with a marked and reassuring reduction in the number of complaints about speed. The Open Charts initiative was also warmly welcomed, even if some issues still need addressing.

There is some customer dissatisfaction with the weak or incorrect signals seen in extended range (monthly) and (particularly) seasonal forecasts. This dissatisfaction seems to stem from unrealistic expectations linked to the

considerable societal benefits that could be realised if accuracy were achieved. Regular reference to verification statistics alongside new forecasts could quell the misplaced optimism. ECMWF should make this easier; indeed user desire for more and better verification data, for longer ranges, was highlighted by an online survey in 2021.

The increased uptake of certain Copernicus products (e.g. from ERA5 and CAMS-IFS) was very good to see, although we would encourage NMSs to consider making more use of the C3S multi-model seasonal forecasts.

## 1. Introduction

Every other summer ECMWF invites Member and Co-operating States to submit updated reports on the application and verification of ECMWF's forecast products. The NMSs (National Meteorological Services) submitted their reports, which are now available here: [https://www.ecmwf.int/en/publications/search?secondary\\_title=%22Green%20Book%202021%22](https://www.ecmwf.int/en/publications/search?secondary_title=%22Green%20Book%202021%22).

Reports have been provided by Austria, Belgium, Croatia, Czech Republic, Estonia, France, Germany, Greece, Hungary, Iceland, Ireland, Israel, Italy, Lithuania, Luxembourg, Netherlands, North Macedonia, Portugal, Romania, Serbia, Slovakia, Spain, Sweden, Switzerland, Turkey and United Kingdom.

A summary of the reports is presented below. Content has been combined with some feedback from ECMWF's 2021 UEF meeting, held virtually, and from official triennial Member State/Co-operating State liaison visits undertaken by ECMWF between July 2019 and June 2021. In chronological order, "visits" were made to Austria, Lithuania, Latvia, Netherlands, Montenegro, Serbia, Ireland, Estonia, Switzerland, Belgium, Luxembourg, Turkey, Norway, Sweden, North Macedonia and Finland. The COVID pandemic led to many of the "visits" being virtual. In using the associated visit reports we focussed on countries that did not send in an Application and Verification report.

Please note that this report generally only covers aspects recorded in the above fora, and indeed cannot reproduce everything included there. So whilst we have tried to extract and summarise the most important aspects in this Technical Memo many will inevitably not be referenced directly.

For the NMS reports contributions had been invited under the following headings:

1. Summary of major highlights
2. Use and application of products (direct and "other")
3. Verification of products (objective and subjective)
4. Requests for additional output
5. References to relevant publications

For section (2) ECMWF encouraged submission of details regarding post-processed products created using Artificial Intelligence and/or Machine Learning techniques, and also feedback on ECMWF's Open

Charts initiative, that went live in October 2020. For the verification section (3) we encouraged submission of results from conditional verification, and from comparing Limited Area Ensemble Prediction Systems (LAM-EPS) with the ENS.

Note also that the ECMWF IFS is generally upgraded each year, which naturally affects aspects of performance in-year, so summary information presented here should be read with this in mind. During the past 24 months two new cycles were introduced: 47r1 on 30 June 2020 and 47r2 on 11 May 2021.

Note that the results of ECMWF's own objective verification are considered separately, in ECMWF Technical Memorandum 884 (<https://www.ecmwf.int/sites/default/files/elibrary/2021/20142-evaluation-ecmwf-forecasts-including-2021-upgrade.pdf>).

## 2. Use and application of products

Strategies for using ECMWF model output for operational purposes depend largely on the lead time of the forecasts. Although NMS reports and visits to Member and Co-operating States do not encompass every forecasting activity, all 30 countries evidently do use IFS data for medium range forecasting, and the majority also use ECMWF's monthly (=extended range) and seasonal (=long range) forecasts for operational purposes. There was also evidence that just about all 30 states represented use IFS data directly in some way to prepare short range forecasts (up to, say, 48–72h ahead). Some NMS make less use of ENS than one might expect, particularly for shorter leads. For example Austria indicate that ENS is used as additional information [to HRES], mainly in critical weather situations, whilst Greece and Finland highlight that ENS usage centres on day 4 onwards, with HRES output being the focal point at shorter leads, along with LAMs. Norway indicate that ingesting into their workstations the vast data volumes available for ENS is technically challenging. Note that with the resolution increases ECMWF plans for 12-18 months' time data volumes for ENS will increase markedly.

In the short range ECMWF IFS products are commonly used in conjunction with products from other sources, notably deterministic Limited-Area Model (LAM) systems, but to an increasing extent LAM-EPS too. In the vast majority of cases reported, ECMWF IFS data provides boundary conditions (BCs) for these limited-area systems, which are commonly run four times per day (matching IFS run frequency) but sometimes run more often, in, for example, 'rapid update' mode. Ordinarily LAM systems use BCs from the "previous" set of IFS runs - typically 6 hours old - to ensure product timeliness; this seemingly imperfect set up is probably unavoidable. Some LAM-EPS systems use BCs from more than one global EPS system. In a quick tally of the resolutions reported for LAM systems used operationally by NMS, the proportions were as follows:  $\geq 4\text{km}$  - 15%; 2.1-3km - 55%; 1-2km - 25%;  $< 1\text{km}$  - 5%. The highest resolution operational LAM-EPS system may be the one run by Switzerland - a COSMO 1.1km configuration. Meanwhile Switzerland have just retired their 7km COSMO deterministic model, due to its lower resolution. In the medium, extended and longer ranges, ECMWF products continue to be the main or only output used by NMSs. References to other global forecasting systems being used for these lead times are rare, but include, for the medium range, MOGREPS-G (from UK), GFS (from USA), and ICON (from Germany), and, for the extended range,

GLOSEA (from UK). Virtually all NMSs seem to provide forecasts of some sort up to lead times of 10 days. Whilst the main operational focus for all Member and Co-operating states is on local weather, some also have international commitments, for land and sea areas across the world, for which ECMWF forecasts are used in different ways.

## **2.1. Direct use of ECMWF products**

At shorter ranges, most NMS forecasters examine ECMWF products alongside output of their main LAM-based systems, which themselves, as discussed above, usually also incorporate ECMWF input via BCs. Around day 3 or 4 focus shifts onto using mainly or only ECMWF output. This all means that ECMWF forecasts are vital for a vast range of operational functions in most if not all the Member and Co-operating states. Very appreciative comments regarding ECMWF output can be found throughout the NMS reports.

ECMWF facilitates direct product visualisation through static clickable images on the ECMWF website, within ECMWF's complementary tools "ecCharts", and (related to this) "Dashboard". All three web-based tools continue to undergo upgrades and re-design work to improve usability.

A key upgrade to the static clickable image class took place in Autumn 2020 when "Open Charts" went live; this provided new formats and layouts for pre-existing products, and some new products also, and went hand-in-hand with opening up free access to a whole range of ECMWF forecasts around the world. This year ECMWF specifically asked NMSs for feedback on Open Charts; this is summarised in Section 2.1.5.

ECMWF output can also be viewed in static form on websites internal to NMSs. Some NMSs also continue to use the ECMWF graphics tool Metview to create plots for forecasters.

ECMWF output is also often viewed directly by forecasters on independently developed dedicated forecaster workstation systems (such as "NINJO", "HAWK", "Visual Weather", "Synergie"). Most countries ingest into these a range of ECMWF products (especially from HRES). These workstations offer one major advantage: they allow many forecast relevant products to be overlaid (e.g. output from multiple global and limited area models/ensembles, observations, satellite data). However, one downside of this approach is that it may also 'prevent' access to the full range of ECMWF output: Luxembourg for example highlighted that the "Synergie" system they use is not currently able to ingest ENS data. Users are again reminded that ecCharts provides a WMS service to facilitate the transfer of ECMWF data into local workstations.

### *2.1.1. ENS and HRES*

Whilst the ENS is central to ECMWF's 10-year strategy it is again clear this year that our HRES forecasts are still very widely used, and in some NMS, for various reasons, these are used in preference to ENS output. Evidently the extra resolution provided by HRES brings benefits for many countries, especially those that are topographically complex, and so it is more meaningful then to compare LAM

forecasts with HRES than with ENS. Upgrading ENS resolution (to ~10km), as ECMWF will do in cycle 48r1, should make its usage more appealing in this context.

### 2.1.2. Severe weather

Another key tenet of ECMWF strategy is to alert forecasters of potential severe events as early as possible, to facilitate timely issue of accurate warnings. Referring to ECMWF forecasts Croatia say, reassuringly, that there were “rarely severe weather situations it missed or in which it had big errors”. The longest lead time at which official warnings *can* be issued still varies a lot by country; the maximum seems to still be 7 days, in the UK. Because of these variations the extent to which ECMWF output is actively used will also vary, with the output of Nowcasting tools and LAMs inevitably given a lot of weight at short leads. Interpretation in terms of likely societal impact, the use of impact models and consultancy with emergency services seem also to be growth areas when it comes to issuing warnings. The UK, Italy and Iceland reference these.

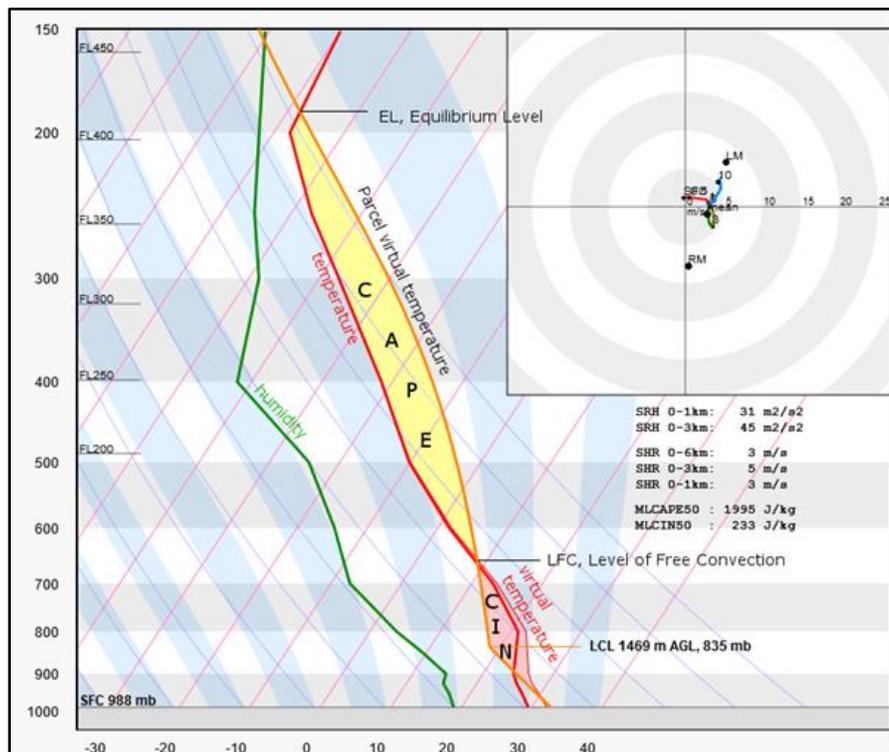


Figure 1: Vertical sounding (Skew-T-log-p), identifying some parameters used to anticipate severe convective storms. New parameters in cycle 47r3 move away from using temperature in the construction of CAPE and CIN (a computationally expedient approximation), and use instead virtual temperature, which is physically correct.

Warning systems are becoming more probabilistic in nature, except perhaps at short leads, and overall ENS usage seems to be increasing. Whilst the EFI and SOT, which are based on ENS, have been widely

used to alert forecasters to severe events for many years, usage continues to grow. Many NMS reports include favourable comments about uptake and usefulness - Greece, Iceland, Ireland, Israel and Spain all refer to using the EFI in their warning processes. ECMWF naturally encourages this, provided the limitations are understood. There is an innate link between impacts and EFI/SOT, because of the return period philosophy that underpins both. Indeed, the EFI should be able to assist with early warnings for rain, wind, heat, cold and snow, and also, via the CAPE and CAPE-shear EFI/SOT parameters, for hazards linked to severe convective outbreaks. Croatia give the impression that forecasters are less happy with the CAPE-based EFI fields than they are with the other parameters. We reiterate that CAPE is a complex field to deal with numerically, and that over some years, and in collaboration with ESSL, ECMWF has been gradually upgrading many parameters related to CAPE and CIN. Many new variables will become available with cycle 47r3 (Oct 2021), and in the following cycle, 48r1, the EFI fields related to CAPE will also be upgraded (see Figure 1).

Meanwhile some NMSs report continuing usage of probability products (e.g. Spain), which can help more with threshold-based warnings.

In the last 3 years (2018-2020) ECMWF received a lot of positive feedback regarding the mainly-ENS-based precipitation type products (meteograms and maps) that had been introduced in 2017. These products have been praised again, presumably as recognition, understanding and uptake have increased. For example, in Finland these are viewed as an “excellent product” whilst Croatia say “hugely popular, gold medal award”. Conversely in their report Estonia *requested* a probability product for “glaze”, due to recent events with major impacts. Although glaze is technically freezing rain further investigation identified that they were particularly interested in knowing when ice would accrete on specific surfaces such as power lines or roads. Physically, power line accretion and road accretion are different; the former can be expected when the IFS predicts freezing rain, for the latter the situation is much more complex. It is now clear that we need to make this distinction clear to users, and so the Forecast User Guide will be updated accordingly. This example also nicely re-emphasises the benefits of dialogue with users.

UEF provided many examples of positive feedback on ECMWF forecast performance for severe weather events. For an extreme rainfall/snowfall/flooding case in late December 2020 Montenegro described our forecasts as “very, very good”. For more examples, often related to severe weather, see here: [https://events.ecmwf.int/event/220/sessions/363/attachments/1222/2279/UEF2021\\_Hewson\\_updated.pdf](https://events.ecmwf.int/event/220/sessions/363/attachments/1222/2279/UEF2021_Hewson_updated.pdf) (specifically the answers to question 5).

### 2.1.3. *ecCharts*

ecCharts is actively and increasingly used in many countries. It has many components, and along with many favourable comments about the facility overall other aspects were singled out by users for special praise, such as the precipitation-type-related charts, as outlined above, and the vertical profile products also introduced relatively recently. Comments on these included “useful”, “particularly useful”, “of great value” and “great potential” from Lithuania, Portugal, Croatia and Finland respectively. As in previous years there have been some negative ecCharts comments too, about the slow speed, but the prevalence of these is less, with Montenegro for example now highlighting how speed increased

markedly when they upgraded bandwidths. This indicates that speed is not always a software/ECMWF issue, although we acknowledge that there is always room for improvement in our services. As usual there have been many requests for expansions to ecCharts, e.g. changing to hourly data, including cross-sections, adding a trajectory tool (see also Appendix 1).

#### 2.1.4. *New Products*

Many new products appear first within the ecCharts framework, whilst some go into Open Charts. For example, in the last year extended range CDFs, for week-long time periods, for temperature and precipitation anomalies, were introduced into ecCharts, whilst EFI and SOT for multi-day snowfall, to mimic the multi-day precipitation EFI/SOT, are now available in Open Charts, following requests from some mountainous countries. Feedback on these is encouraged. Meanwhile the cyclone database products (which again received favourable comments), which have their own web platform, were revamped in 2021 by ECMWF (see <https://www.ecmwf.int/en/about/media-centre/focus/2021/ecmwf-synoptic-style-weather-charts-set-tools-help-forecast-adverse>), in a fashion that paves the way for ingestion into ecCharts at some future point. ecCharts integration in this way is a long-standing request from users.

In April 2019 ECMWF introduced a new experimental ‘point rainfall’ product into ecCharts (from a suite called ‘ecPoint’). This post-processed product aims to deliver reliable and skilful probabilistic forecasts of rain-gauge-measured rainfall. This is done by adjusting for expected weather-dependant biases and sub-grid variability, that together make raw ENS forecasts of gridbox-average rainfall less valid at points, especially in convective situations. In their reports both Switzerland and Hungary report very positive results in formal assessments of these products - see verification section 3.2. Hungary highlight that ecPoint product usage is “more and more integrated into the operational practice in general forecasts and warnings”. Meanwhile Norway state that point rainfall is very useful and works well, whilst UK say it is one of ECMWF’s more popular products. ECMWF work on creating WMO-approved grib-format ecPoint files for MARS archiving is nearing completion.

#### 2.1.5. *Open Charts*

In the first instance Open Charts aimed to replicate the content of ECMWF’s pre-existing static web chart offerings. Whilst NMS users had already had access to those, the fact that a login was no longer needed with Open Charts was highlighted in reports as useful. Indeed, we received many appreciative comments on the move to an open data policy, and on the Open Charts functionalities.

Regarding Open Charts functionality, the scalable SVG format output adopted was highlighted as especially useful by several NMS. Meanwhile Portugal said the ability to now quickly intercompare recent forecasts, for a given time, was also a valuable new tool. This feature is not clearly advertised however: to access users need to click on the four orange squares next to the “valid time” drop down menu (Figure 2). Some NMS stressed that they find Open Charts particularly useful for examining and

preparing extended range forecasts - probably because there are more extended range chart offerings than we had had hitherto.

Some issues with Open Charts have also been reported, related for example to legends, and to the overly large “thumbnails” on the entry page which necessitated a lot of scrolling, thereby making accessing a product more difficult than it used to be. Croatia complained about rather frequent error messages - e.g. “We’re sorry. Package has not been found.” The absence of some metadata in some formats was also criticised by Italy. Users should always have sight of the base time, the lead time and the step (e.g. “T+120”), and this is not always the case - in full screen mode for example one cannot see the step or the base time. Meanwhile the UK indicate that one frustration is that pop-up windows such as Meteograms (triggered by clicking) do not always fit on the screen. They also requested a new feature - to be able to set up a default area.

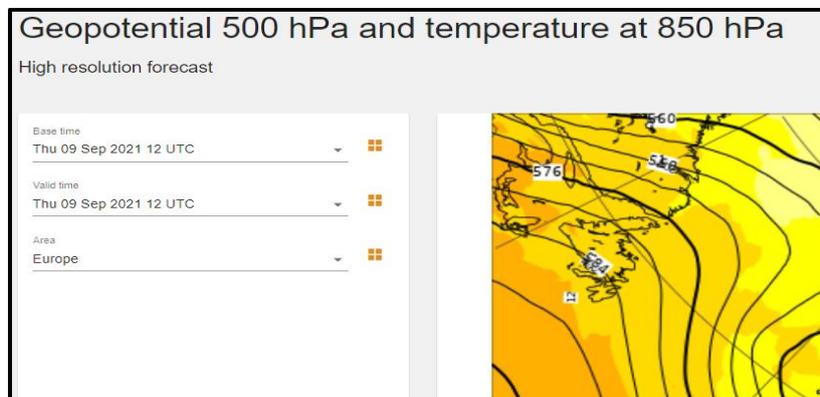


Figure 2: Screen grab segment from an Open Charts product. Clicking on the clusters of orange squares helpfully triggers multiple plots on the same page - e.g. all forecasts for a given valid time.

As always ECMWF will continue investigating and addressing the issues and requests raised by users, to the extent that resources permit. Related ongoing activities include better documentation for each product (with links also to the online Forecast User Guide), and introduction of many more new products. The overarching goal here is to provide, within Open Charts, in some format and with suitable documentation, access to every variable currently available to ecCharts users (albeit without the interactive functionality that ecCharts offers).

Finally, please note that ECMWF will soon be closing down the old static chart products web page. Croatia advised that they are still using these, through “permalinks”, so users there and elsewhere are strongly encouraged to migrate and change links as soon as possible.

## 2.2. Other Uses of ECMWF Output

### 2.2.1. Post-processing

Out of the 30 NMS referenced directly in this report, 19 report on activities involving post-processing of model output. Not all such activities will have been described, so probably the true proportion is

higher. Technique complexity ranges from simple bias correction, applied to some HRES output in Iceland, through to advanced post-processing and blending of LAM and global ensembles, using EMOS and some AI/ML techniques, in Switzerland. Note that simple bias correction can deliver big gains if the biases are large, and relatively consistent, as in some mountainous countries like Norway and Iceland where they are actively used. MOS (with deterministic, ensemble mean, or other output) and Kalman Filter post-processing approaches are relatively common (cited by 4 NMS in each case). Indeed Figure 3 illustrates that Germany are applying MOS techniques to many forecasting challenges, whilst Figure 4 is a nice example of visibility probabilities, based on MOS, from The Netherlands.

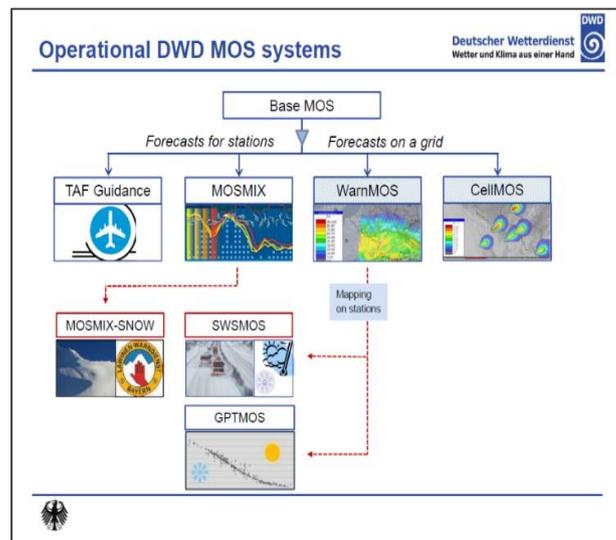


Figure 3: The many MOS systems operational at DWD, comprising: terminal aerodrome forecast (TAF) guidance, localised forecasts (MOSMIX), avalanche guidance (MOSMIX-SNOW), road maintenance (SWSMOS), energy consumption (GPTMOS) and warning guidance (WarnMOS, CellMOS).

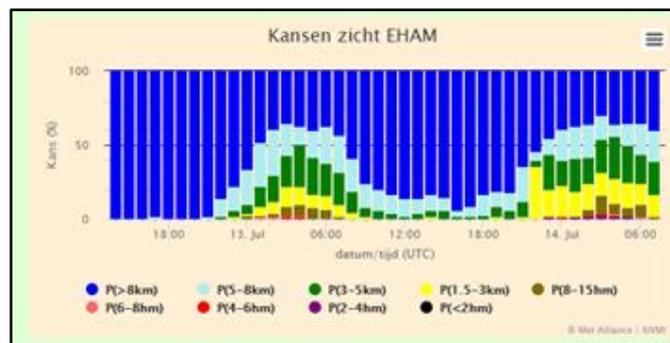


Figure 4: Example of a KNMI post-processed (MOS) product: a site-specific time sequence of visibility probabilities, for TAF creation.

Blending the output from multiple models / ensembles, to achieve accuracy and seamlessness, seems to be a growth area (Croatia, Germany, UK, Portugal, Switzerland).

Whilst many variables can be post-processed, those used most often are simple variables where the gains can be high, and for which extensive data for calibration exists, such as maximum and minimum 2m temperature and 10m wind (an example is shown in Figure 5). Precipitation is more challenging, and probably comes third in the list. Occasionally other variables are addressed - Ireland for example apply a form of quantile regression to ENS solar radiation forecasts for a public web site.

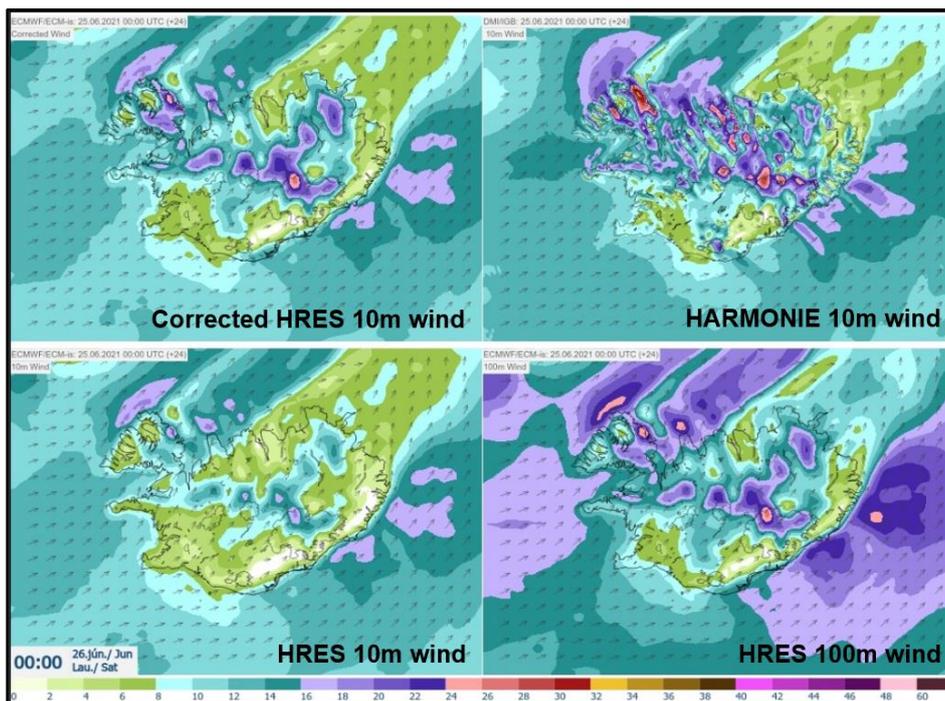


Figure 5: 24-hour forecasts valid on 26 June 2021 00 UTC, showing the effect of simple HRES wind speed post-processing by Iceland. HARMONIE output, which exhibits small biases compared to observations, is shown top right. Raw HRES 10m and 100m winds are shown bottom left and right respectively, whilst the post-processed HRES 10m wind, which is based on these, is shown top left. Scale shows speeds in m/s (valid for all panels).

References to operational use of AI/ML techniques are hard to find, except in Switzerland’s report. Admittedly usage impressions depend on what one counts as AI/ML - for example should the decision trees used by Italy to classify weather phenomena be counted as such? In any case some NMS are now beginning to do research explicitly into new AI/ML techniques - so this is becoming a growth area.

Another growth area seems to be downscaling, of 2m temperature in particular. Austria again report on this, with examples from their SAMOS initiative, still in pre-operational mode, which aims for example to convert IFS output to a 1km grid (in complex terrain) using old 1km INCA analyses as truth for that grid, for calibration. Spain meanwhile use a somewhat simpler approach to achieve the same goal: lapse

rate adjustments based on altitude mismatch, combined with an observation-based bias correction. A somewhat similar activity has begun in Romania. For extended/seasonal ranges they now re-create, from forecast anomalies, expected true values of 2m temperature, rainfall, wind, and a drought index, for week-long periods, by post-processing forecasts using a reference 10km scale gridded climate. Care is taken to avoid negative precipitation. This is all aimed at users interested in absolute values but lacking the wherewithal to adjust anomalies themselves. The higher resolution will be an added advantage. The downside will be the low skill levels of seasonal forecasts. It seems the main users are in agriculture.

Where post-processing does not deliver gridded forecasts, which is still true in most cases, output is usually provided for a set of sites for which there are observational records. The larger NMS's site sets often cover the world, whilst smaller NMSs focus on Europe or just their own country. In some instances, the number of predictors used is extremely large: Germany say they are unique in having over 300. These will include not only raw model output but also derived parameters.

### 2.2.2. *Derived Fields*

Derived products are generated locally in NMSs for many reasons: often for use by NMS forecasters, also for specific societal or economic applications, and sometimes for use by the public. Ordinarily derived products are quite different to those historically provided by ECMWF, although on occasion ECMWF outputs are re-derived in a way that is more tailored to local needs. The range of products offered by NMSs continues to grow slowly, in parallel with increased availability of more diverse raw model output, as the models themselves build in more and more earth system components, and handle those in increasingly realistic ways. Simultaneously users become ever more demanding in the diversity of their requests, and their expectations, as they realise what could be on offer. Discussion by Estonia of poor IFS handling of ice depth for large lakes is a case in point; this would not have even been contemplated 10 years ago. We expect the trends to continue. A step change in this regard will come, for example, when ECMWF introduces a multi-layer snow scheme in cycle 48r1; it is likely that any current usage of snow-cover-related output will then need to adapt.

Convection-related indices continue to be generated in many Member and Co-operating States for forecasters (Croatia, Czech Republic, Hungary, Italy, Romania, Slovakia). Sometimes these are created within a forecaster's workstation (e.g. Visual Weather was mentioned by Croatia, which can incidentally also deliver grib-format derived-field export). Such activities evidently reflect the lack of a discrete representation of the hazard at global model resolution and severe impacts that can arise (even if ECMWF's point rainfall and lightning density products go some way to addressing such limitations). Due to COVID ECMWF's plans to examine potential hail predictors were placed on hold, but we hope to restart soon. This could also be of interest for hail suppression activities carried out in some central and eastern European countries. Indeed, Hungary say that from 2021 they have been deriving and using, operationally, hail predictors based on IFS output, so there may be scope here for collaboration.

Israel have now introduced a UV index based on the CAMS version of the IFS (C-IFS). Previously they used the standard IFS output; C-IFS output has the advantage of taking aerosol into account.

In regard to regime-style clustering of ENS output, ECMWF’s inevitably broadscale approach does not necessarily suit the needs of every country, and this year several countries again highlight that they are using local clustering to define locally relevant weather regimes. Some are using software provided by ECMWF to do this - e.g. Austria, Spain. Austria are also computing probabilities - e.g. for rainfall - for each cluster. This is an interesting new development. Germany are doing something similar. The UK again report in detail on their own weather regime classification, show how it compares with ECMWF and illustrate usage in public forecasts (Figure 6).

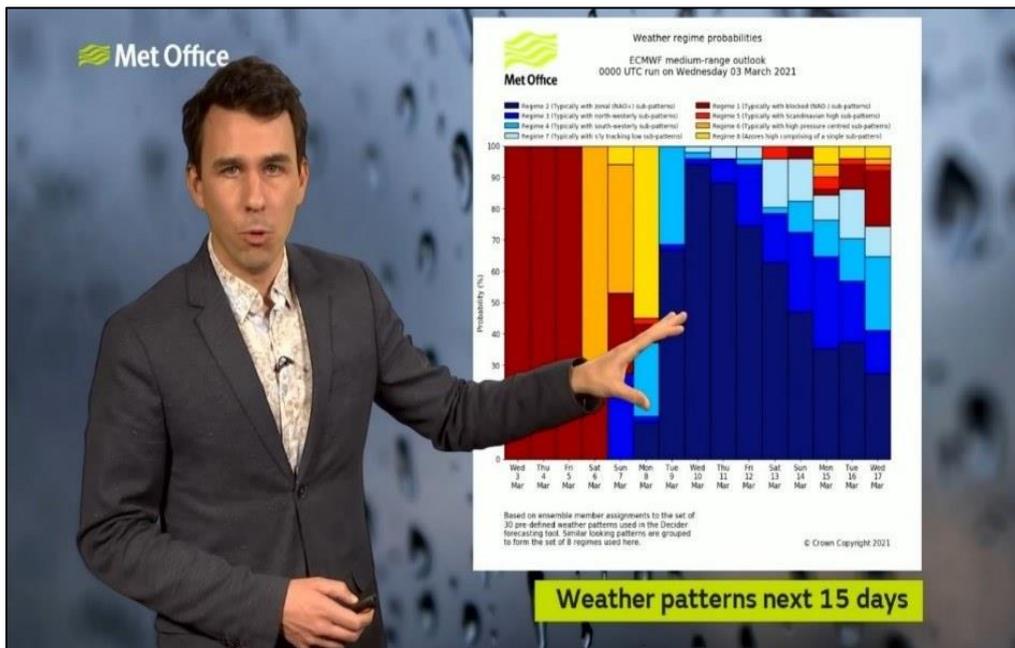


Figure 6: Aidan McGivern using stacked probability bar charts to highlight a likely change of regime shown in ECMWF output. Regime definitions come from the Met Office DECIDER system.

Many NMS again list many other miscellaneous derived fields that they generate from IFS output. There were strong similarities with what was reported in 2019, so for brevity details will not be reproduced here. Please refer instead to Section 2.2.2 of the related 2020 Technical Memorandum #860: <https://www.ecmwf.int/sites/default/files/elibrary/2020/19461-use-and-verification-ecmwf-products-member-and-co-operating-states-2019.pdf>

### 2.2.3. Limited Area Modelling

ECMWF output, in one form or another, is used very widely to provide boundary conditions (BCs) for running limited area models, and in some instances initial conditions (ICs) for the atmosphere and/or the earth’s surface for those models too. Mostly this happens via the Optional “Boundary Conditions” Programme which provides additional HRES and ENS forecasts from 06 and 18Z data times, at hourly intervals.

The “deterministic” LAM models that use ECMWF data, e.g. via the Boundary Conditions programme, and that are referenced this year, are ALADIN, AROME, ALARO, HARMONIE, COSMO, WRF, WRF-NMM, NMMB, ICON-LAM and INCA (nowcasting). Typically, these run 4x per day, although there is a lot of variability.

The LAM-EPS systems, which are essentially based on versions of the above, have the acronyms: A-LAEF, C-LAEF, COSMO-E, MEPS, COSMO-ME EPS, COSMO-IT-EPS, COMEPS, AROME-EPS, IREPS. Sometimes these LAM-EPS systems use ENS data for boundary conditions, although creative alternatives also exist. Often the EPS versions have somewhat lower resolution than their “deterministic” counterparts, because of computational resources, though sometimes this challenge is instead met by running the ensemble much less frequently - e.g. just once per day.

Whilst it is difficult to arrive at a representative figure the average maximum lead time for LAM and LAM-EPS systems seems to be ~60h, although the range is large, from 12h in a nowcasting mode (24x/day), out to 144h for one 4km model. Operational domains naturally vary, both in size and location. Most inevitably centre on European countries, though France run also for some overseas domains.

The other modelling class where ECMWF forecast data is used, often much more directly, is trajectory, dispersion and air quality modelling. Activity in this field continues to grow but remains largely deterministic. The models/modelling tools referenced, which vary greatly in complexity, are called: NAME, HYSPLIT, MOCAGE, LAGRANTO, CMAQ, EMEP, LOTOS-EURO, FLEXTRA and FLEXPART (the last two come from ECMWF). Some of these run continuously, others can be triggered in the event of (e.g.) a dangerous chemical release. Initialisation data, in the form of chemicals and aerosol, is in some instances provided by C-IFS.

Hydrological modelling is a more limited activity in NMS in general, in part because some NMS do not have this responsibility. Nonetheless, the operational MIKE11, DFFGS and HBV hydrological model systems (and one or two others that were unnamed) generally use ECMWF data in one way or another (e.g. to provide rainfall and other input directly, or BC data to a LAM that then provides these). Some NMSs described handling snowmelt and ice jams as problem areas.

For countries with coastlines surge, wave and oceanographic modelling can be particularly important, and ordinarily this activity does come under NMS jurisdiction. Reference is made in reports to using the associated high resolution MFWAM, WWM, WW3, SWAN, TSSF, HYCOM and NEMO modelling systems, which in various ways are linked to ECMWF models, even though ECMWF does not perform surge modelling at this time. Norway have shown interest in using the IFS coupled system for storm surge modelling, highlighting that the already-predicted sea surface height takes into account Ekman transport but not the inverse barometer effect, and showing that output could be improved by integrating that too.

Finally, Greece again note their use of the MOTHY sea pollution model which can be optionally driven by HRES forecast fields.

### 3. Verification of ECMWF products

Most countries have reported results from the verification of ECMWF forecasts, generally by comparison with observations in the local area of interest. Of relevance to interpretation are the dates of the most recent upgrades to the IFS:

Cycle 46r1 became operational 11 June 2019

Cycle 47r1 became operational 30 June 2020

Cycle 47r2 became operational 11 May 2021

This means that in this year's reports verification corresponds mainly to cycles 46r1 and 47r1, half and half where data presented is for 2020.

As always, *year-on-year* changes in IFS performance depend also on the prevalence of different synoptic patterns, that can have different associated error characteristics, so apparent changes in performance relative to "last year" need to be treated with caution. Internally, to assess the long-term skill evolution, ECMWF often subtracts from statistics for the operational forecast the equivalent statistics derived from a fixed model version run over the same period (currently based on ERA5), which can help eradicate impacts of this type. Interestingly, the Switzerland report includes examples that use a similar approach.

And when considering a *fixed verification period*, there are likewise several reasons why one would not necessarily expect consistency, a priori, in the verification results (e.g. bias, RMSE, etc.) reported by different countries. Firstly, different weather patterns will have very probably prevailed in different regions. Secondly, the impact that a certain weather type has on skill and biases will manifest itself differently in countries with different (fixed) geographical characteristics. For example, issues handling orographic rainfall, which we know exist, will clearly have little or no impact on a flat country, but can have a substantial impact in mountainous regions. And thirdly, a range of "interpolation" and "site-selection" techniques are being used. Full resolution IFS output is not always being exploited, and in some reports received the method(s) of extraction and interpolation are not entirely clear.

A conditional verification approach (which is now being increasingly used at ECMWF) can help resolve some of the issues listed above, and results deriving from that are presented below. To improve clarity such results are now incorporated into sub-sections of 3.1, rather than being grouped in a sub-section of their own.

#### 3.1. Direct ECMWF model output (HRES and ENS), and other NWP models

Many reports focus on comparing HRES with LAMs, and for this reason usually centre on the shorter ranges (up to about 48/60h). However, care is needed in the direct comparison of verification results for very different spatial resolutions. Different verification methods may be more appropriate to evaluate high resolution outputs. In reports this has been addressed in different ways, for example to circumvent

the well known ‘double penalty’ problem when verifying high resolution precipitation forecasts. Overall, using a neighbourhood approach and a combined index for precipitation and wind gust, France report AROME-FRANCE consistently outperforms the global HRES and ARPEGE models. Israel have accounted for observation representativeness in the verification of several parameters. They report that their LAM-EPS performs better than ENS over Israel for all evaluated variables.

As noted in Section 2, LAM systems often use boundary conditions from the “previous” set of IFS runs (typically 6 hours old), which as reported by France can adversely affect LAM scores, especially in the short range.

All the reported comparisons between LAM and ECMWF global model forecasts provided useful feedback on the capabilities of the ECMWF system. However, given the above considerations, here we refer to comparison with LAMs when it helps to illustrate particular issues with the ECMWF forecasts. See the individual country reports for more detailed results.

A common finding, seen in virtually every verification result, for almost every sensible weather parameter, was that biases in IFS forecasts have a diurnal cycle. Annual cycles are also often presented. It is not that uncommon for the nature of these cycles to differ between countries. So for reasons of brevity and clarity we do not discuss every diurnal and annual cycle that has been illustrated in NMS reports.

Ultimately all models have their strong and weak points, and the impression one gets from the wealth of statistics provided is that in the short ranges at least (where the bulk of the comparisons were performed) a multi-model approach to forecasting continues to have considerable merit. Indeed, this fact nicely underpins the growth in model output blending, discussed above in Section 2. Incidentally, ECMWF has also had recent involvement in model blending in the EU-funded MISTRAL project (see: <https://rmets.onlinelibrary.wiley.com/doi/full/10.1002/met.2004>). Multi-model approaches could be even more valuable if one could vary weightings according to known synoptically varying performance characteristics. Whilst such an approach is not yet commonplace in automated blending, it is undoubtedly being used in subjective fashion by forecasters across Europe.

Verification details, by parameter, are given below. Some of the IFS issues arising here were known about, and most of these are also listed in the ECMWF’s publicly accessible ‘Known IFS Forecasting Issues’ web page at: <https://confluence.ecmwf.int/display/FCST/Known+IFS+forecasting+issues>, which continues to be regularly updated.

‘Subjective verification’, that often reflects forecasters’ experiences, has again been incorporated in the sub-sections of this section 3.1. This remains a logical step because perceptions usually mirror features seen in verification statistics.

3.1.1. 2 m temperatures

There was this year reasonable consistency in NMS comments regarding systematic errors in HRES. Many reported that on average minima were not low enough and maxima not high enough. Mean biases in this regard were of order fractions of a deg C, but in clear, calm conditions are typically much larger. In such quiescent conditions error magnitude for individual sites is sometimes >10C for minima (particularly in N Europe in winter), and >3C for maxima. These results tally with ECMWF’s own verification, daily assessments and case studies, and we continue to work to rectify (for a detailed report see <https://www.ecmwf.int/sites/default/files/elibrary/2020/19849-addressing-near-surface-forecast-biases-outcomes-ecmwf-project-understanding-uncertainties.pdf>). Ireland nicely illustrated a particular problem period, for minima, during the exceptionally frosty April we had in parts of NW Europe in 2021 (Figure 7). On this occasion the LAM performs slightly better than HRES.

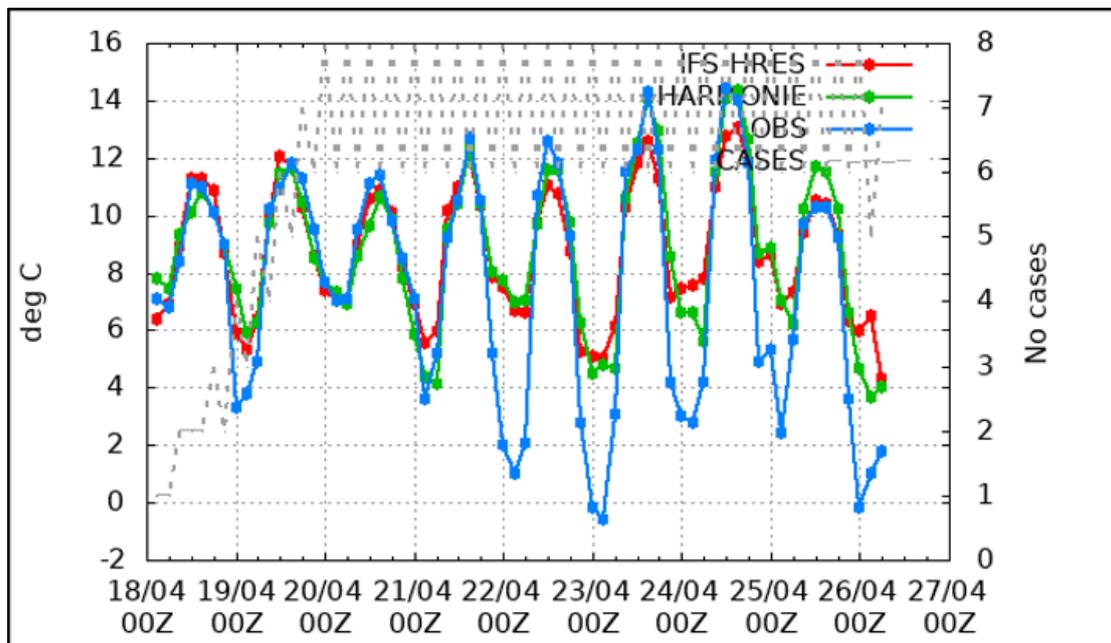


Figure 7: 2m temperature verification for 9 days in April 2021 (x-axis), for Dublin Airport (station 03969), for HRES, and HARMONIE-AROME (2.5km resolution). This is based on averages from 4 runs per day for each, up to T+48, so mostly using 8 values for each forecast data point (see also dashed grey line).

Regarding the performance of LAMs relative to HRES, as examined by many countries, the conclusion is that overall LAMs have *in general* similar or smaller net errors and biases in their 2m temperature forecasts. Interestingly Croatia show how the global ICON model performed better for Croatia, overall, even though its resolution is not that different to HRES (Figure 8). In topographically complex countries, such as Croatia, it may be that there are bigger gains for small resolution increases - on Figure 8 it is mainly the coastal/island sites where ICON has its main advantage.

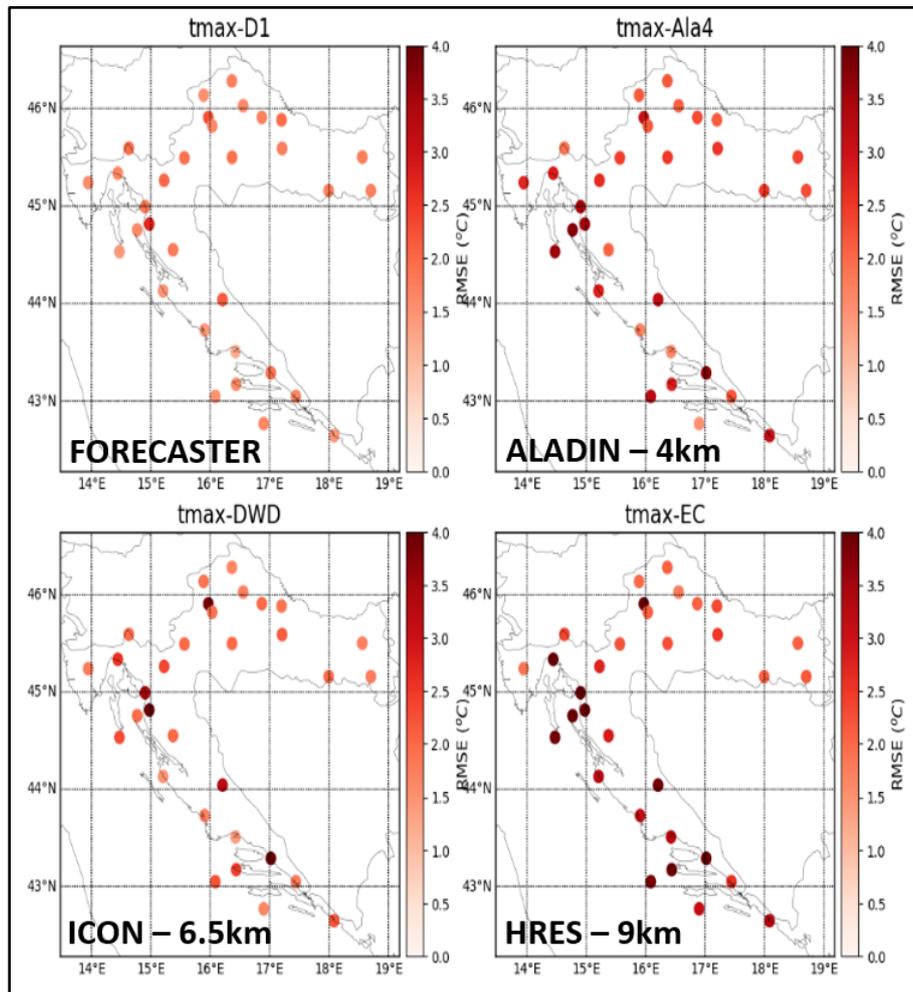


Figure 8: 2m maximum temperature verification (RMSE) for day 2, for Croatia, for 2020, for different models.

The benefits of higher resolution, even sub-km scale, for reducing errors in general, and indeed outlier errors, in another mountainous country (Iceland) are nicely illustrated in scatterplot form on Figure 9.

There are some suggestions that spring is the most problematic season, at least in N Europe, for both HRES and LAMs (Estonia and Sweden highlighted this), with a general cold bias prevailing then. The difficulties of handling snowmelt and indeed patchy dense snow may be contributing.

Austria and Belgium referenced ENS 2 m temperature verification. Austria show overall slightly smaller RMSEs, and slightly better (larger) spread, for the C-LAEFS 2.5km ensemble mean, versus the ECMWF ENS mean (see also Figure 10b for some CRPS scores). Meanwhile Belgium show that ECMWF ENS mean RMSE's are comparable with HRES up to about day 3, and then better, at its selected sites. The lack of a clear benefit from HRES' higher resolution here may relate to (i) the (lack of) topographic complexity around the selected sites, and/or (ii) the uncertainties captured by ENS.

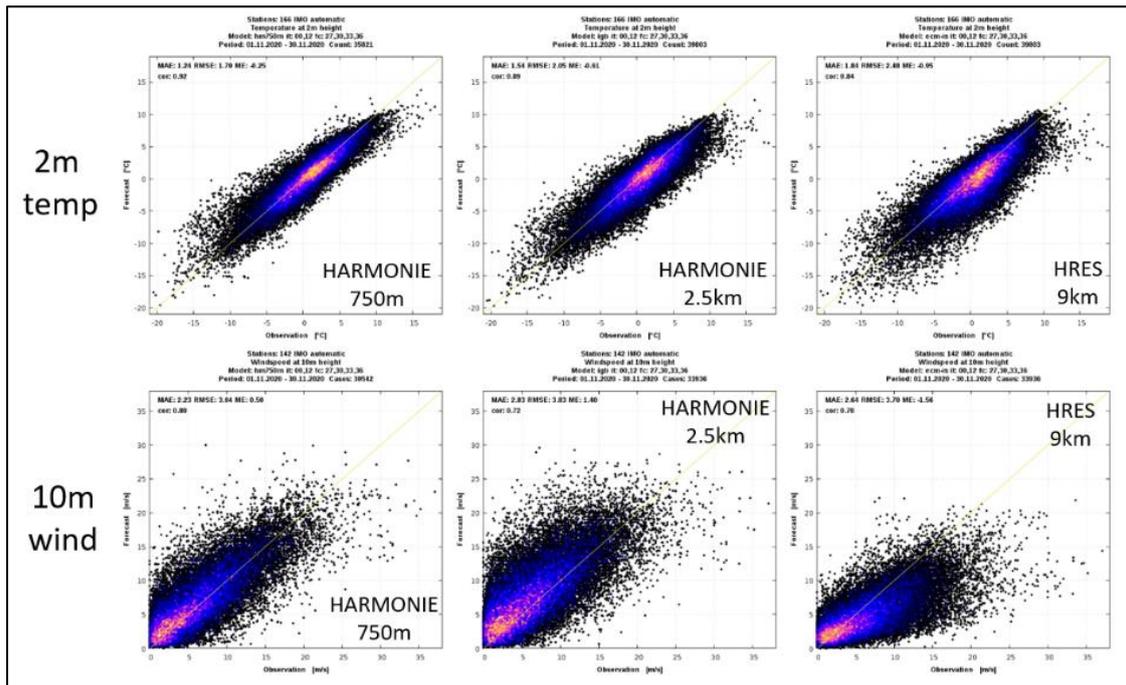


Figure 9: Deterministic run verification scatterplots for Iceland, for 27-36h forecasts, for Nov 2020, for 2m temperature and 10m wind speed (see annotation). Approximately 150 stations were used.

3.1.2. 10 m wind

Previous versions of this report highlighted some conflicting wind verification signals. This year there is more unanimity, partly because some countries have performed more sophisticated investigations (such as sub-setting by terrain characteristics) and so we can now summarise and itemise “pan-European” wind forecast characteristics with more confidence:

- IFS generally over-forecasts wind speeds over relatively flat land areas (mean bias ~0.5-3 kts)
- IFS generally under-forecasts wind speeds over relatively mountainous areas (e.g. Figure 9)
- In the warmest part of the diurnal cycle speeds tend to have a negative or zero bias in all areas
- Whilst LAM / LAM ensemble performance varies, almost all such systems outperform the IFS
- IFS gusts are biased to be too strong (by ~2-6 kts on average)

For evidence supporting the penultimate point, from Austria, see Figure 10d, e. And regarding the final point, note that in cycle 47r3 being implemented in October 2021 there will be a new gust parametrisation which will reduce IFS gust speeds (see also the example on Figure 19).

A very curious feature seen in some results from Belgium is a gradual if small IFS drift (<0.5m/s per 7 days) towards an atmospheric state in which the night-time model winds are lighter. One wonders what the cause is, whether this trend would continue in longer lead forecasts (maximum lead shown was 7 days) and whether it corresponds to discernible drifts in the broadscale synoptic pattern.

ECMWF has followed up on a request by Iceland to reduce roughness lengths over Iceland, to remove the negative IFS wind speed bias there. Results so far have been inconclusive but work continues.

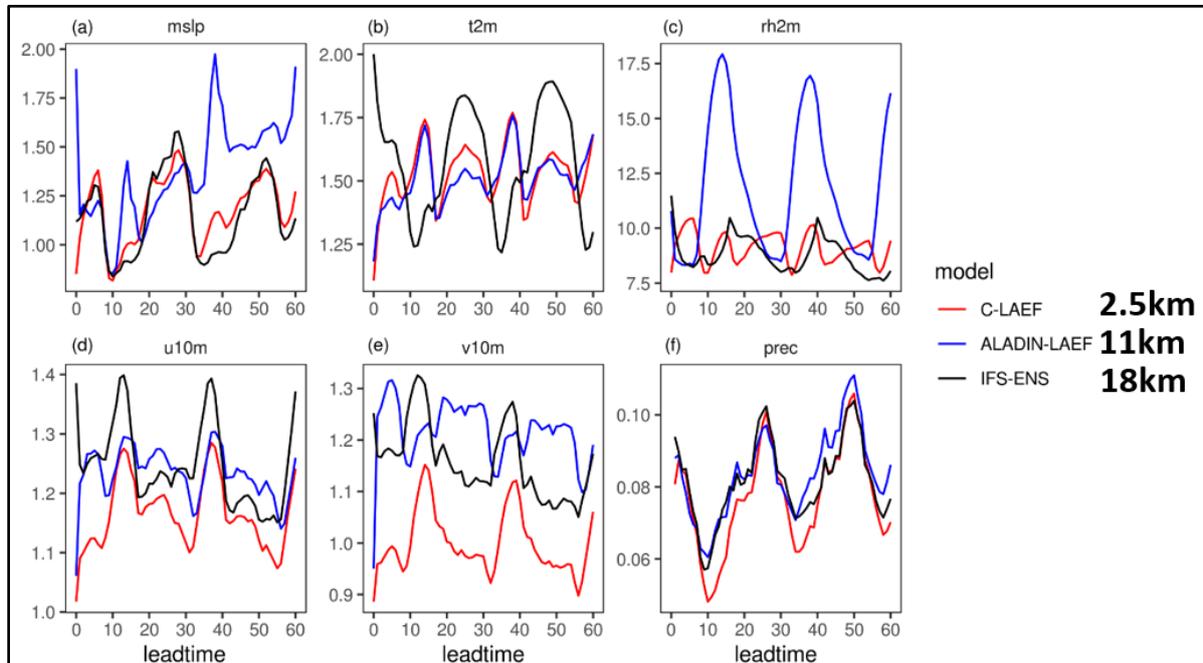


Figure 10: Ensemble verification results (CRPS) for Austria, for Feb/Mar 2020, for 6 parameters (panels (a)...(f) see annotation), versus lead time. Note the clear benefit, for 10m u and v wind components, of 2.5km model resolution.

### 3.1.3. Precipitation

Precipitation verification results and feedback in 2021 reports have similarities with what has been reported before, so some details are omitted this year. Readers wanting more information should refer to earlier version of this memorandum, and this year’s individual reports. At the same time we note, and appreciate, that more results from LAM-EPS systems are provided this year.

When forecast gridbox rainfall totals are verified against point observations, as is very commonly done (at ECMWF also), the scale mismatch can result in somewhat negative conclusions regarding frequency bias (FB), that ordinarily do not reflect true “model issues”. Indeed, LAMs will usually exhibit a “better” FB than global models (for a current example see Figure 11, top panel), but that will be mainly because their gridbox scale is closer to the observation scale. ECMWF is now allowing for resolution-dependant “representativeness” errors in a new way in some of its verification (see: <https://www.ecmwf.int/en/library/19544> accounting representativeness verification ensemble forecasts), and Israel have done this for the verification of several parameters in their 2021 report (using “spread boost” following Klasa et al, QJRMS, 2018) .

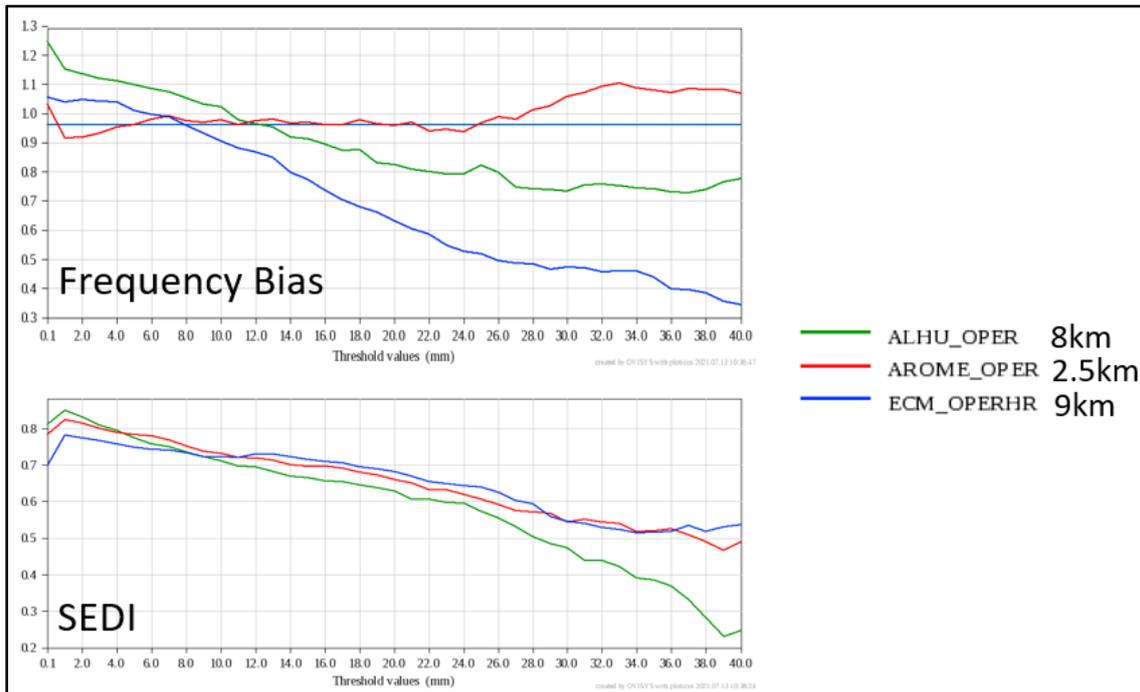


Figure 11: Frequency bias and SEDI (Symmetric Extremal Dependence Index) values of 24h precipitation forecasts (T+6-30h) for 00 UTC runs of HRES (blue), ALADIN (green) and AROME (red) models as a function of precipitation thresholds over Hungary for 2020 using SYNOP observations <400 m above sea level.

For HRES (and ENS) the profile of FB versus totals over a period suggests over-prediction for low totals, changing to under-prediction for high totals (e.g. see Figure 11, showing a crossover of 8mm/24h for HRES). Several countries’ results again highlight this characteristic, albeit with season and region-dependant crossover values. The FB profile slope tends to be less in winter, due to less convection.

Israel show that a COSMO 2.5km ensemble is markedly better than ENS. Meanwhile, in a detailed study of model performance for the SEE-MHEWS project Croatia illustrate how HRES over-predicted in complex coastal terrain, and underpredicted inland (albeit using just a 2-month autumn period), in contrast to the biases one sees in Israel. The complexity of the near-coast topography is probably the fundamental driver here - mountains can trigger too much convective rain through forced ascent, which is opposite to the situation in Israel where the flat coastal plain provides no such uplift, with convective precipitation in unstable westerlies there in the IFS tending to remain (incorrectly) over sea points.

To circumvent the well know ‘double penalty’ problem when verifying high resolution precipitation forecasts several countries (e.g. Sweden, Hungary, Switzerland) have adopted different approaches (e.g. using SAL metrics, or neighbourhood post-processing). However, high density, high quality verifying data is needed: one issue, for example, is the difficulty of obtaining reliable, complete radar coverage in mountainous areas.

A striking result from Belgium was the linear drift to drier conditions seen between days 1 and 7 in the ensemble mean precipitation bias (=mean error) - e.g. green dashed lines on Figure 12. This warrants further investigation by ECMWF, looking at longer leads and other areas.

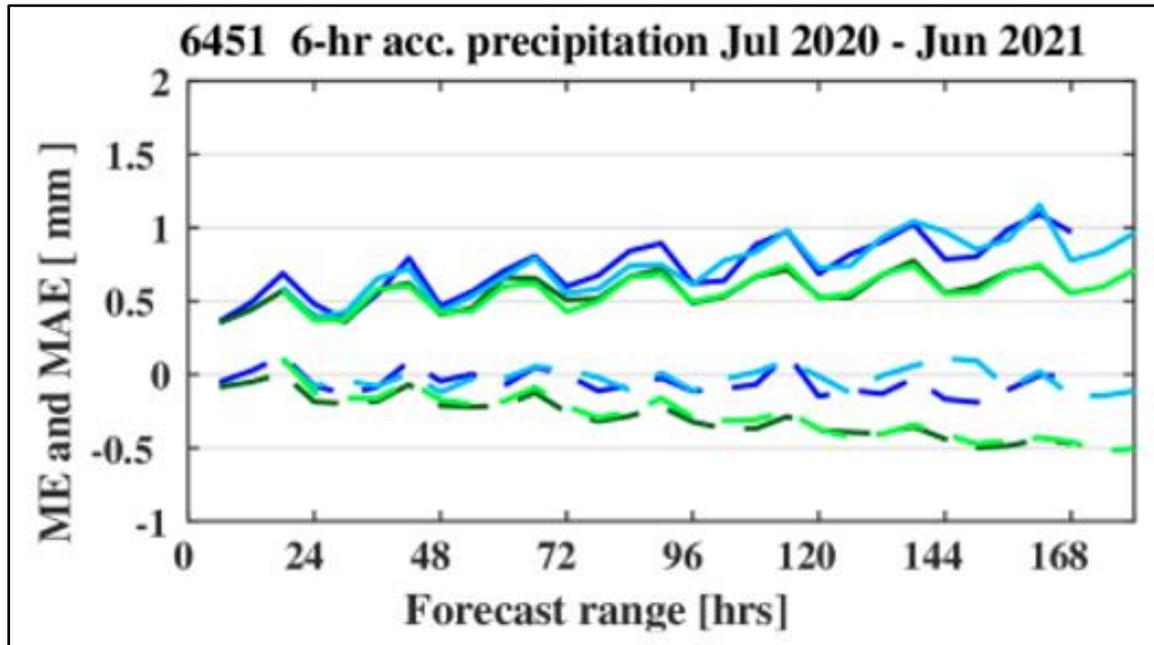


Figure 12: 6h precipitation verification for Brussels, for Jul 2020 to Jun 2021, showing mean errors (dashed lines) and mean absolute errors (solid lines), for HRES (blue) and ENS mean (green), for data times 00UTC (dark) and 12UTC (light). A downward trend in ENS mean error is seen also at other Belgian sites.

We conclude this sub-section by listing some IFS precipitation forecast characteristics reported by NMSs (some objectively verified, some not):

- i. Insolation-driven convective precipitation starts too early in the day
- ii. Convective precipitation is too widespread
- iii. Mountainous areas can be too wet / too dry (Norway/Spain respectively)
- iv. Precipitation forecasts for some tropical regions are contaminated by biases
- v. Unrealistically large totals tend to be predicted in the north-western Andes
- vi. Instances of light coastal precipitation are predicted too often (Portugal)
- vii. Forecast biases vary according to synoptic type in Greece (for details see Greece's report)

Users should be ready for some noteworthy changes in IFS representation of precipitation, related to the new moist physics, that will be seen in cycle 47r3 that goes operational in October 2021. In tandem there will be changes in verification results, particularly when using short verifying periods. Regarding the list above, we expect some improvement in aspects (ii), (iv) and (v).

### 3.1.4. *Screen-level humidity*

Eight of the NMS reports referenced screen-level humidity verification, two more than in 2019. These were Austria, Belgium, Estonia, Greece, Hungary, Israel, Sweden and France. References are made to RH and/or dewpoint. Hungary cover both parameters, showing that a somewhat different picture can emerge depending on which parameter one chooses. This is because these variables have a different dependence on 2m temperature, and therefore on errors in that. Notwithstanding this issue, a fairly clear and consistent picture seems to emerge for Europe, similar to what we saw in 2019. This is that in spite of lower resolution the IFS components are very competitive compared to many LAMs, generally showing smaller net errors and smaller biases. However, Israel report that the 2.5km COSMO-based ensemble is consistently better than ENS, and France report that AROME-OM has better RMSE for 2m humidity for all lead times and all the overseas domains that it is used for. Belgium show a curious steady drift to a drier surface layer, on average, in both HRES and ENS (0.5°C per 7 days in dewpoint). This is undergoing further investigation by ECMWF.

### 3.1.5. *Cloud*

This year, in contrast to 2019, we received no feedback on the quality of irradiance forecasts, and indeed also less feedback than in 2019 on cloud forecasts in general.

Comments by Sweden strongly suggests that cloud verification really needs to be carefully stratified by weather situation - maybe more so than other variables - to provide meaningful physical insights. With objective evidence as support they say, for example, that in the IFS convective cloud is over-predicted in summer, but conversely that dissolution of such clouds late in the day is too rapid. With such complexities in mind and noting that in other NMS cloud verification was not generally stratified (except sometimes by season), we cautiously summarise the general findings.

Norway, Estonia, Portugal and Spain all suggest, sometimes with objective evidence, that the IFS forecasts insufficient low cloud overall. Finland disagree, suggesting that low cloud amounts are too great in summer. In cycle 47r3 we expect low cloud, high cloud and total cloud amounts to all increase somewhat, as a result of the new moist physics package. It will be interesting to see if users notice, and what their reactions are.

Finland have also noted that low cloud is over-forecast in very cold conditions in winter. This may be a feature peculiar to colder countries, as different physics can then come into play. Finland's remark would also seem to be consistent with the prediction of insufficiently low minimum temperatures by the IFS in extreme winter-time conditions.

There is clearly interest in cloud base forecasts, which seem to stem from aviation requirements, which can be quite precise. Israel for example suggest that bases tend to be too low along their coastal plains.

A concerning IFS model drift is again in evidence in Belgium's results; average amounts go up in the ENS by 5-10% between day 1 and day 7.

We conclude this sub-section on positive notes: Croatia say that “all [Croatian forecasters] agree that HRES is very good in differentiating between high, middle and low cloud cover and in cloudiness forecasting in general” whilst results from Greece indicate that mean biases in HRES, in all seasons, tend to be less than 5%.

3.1.6. *Sea Ice and Snow Cover*

Very little was reported this year relating to verification of snow and sea ice. This may mean that there were not many issues. However, Serbia highlighted that anticipating snowmelt, for use in hydrological forecasts, is particularly difficult whilst Estonian forecasters rated the quality of snow depth and particularly ice depth forecasts as "average", and relatively low compared to other variables (Figure 13). Furthermore, Estonia highlighted that ice depth prediction issues for the large lakes Peipus and Võrtsjärv, and for the Baltic, were quite common, and that these tended to also impact negatively on predictions of wind and 2m temperature.

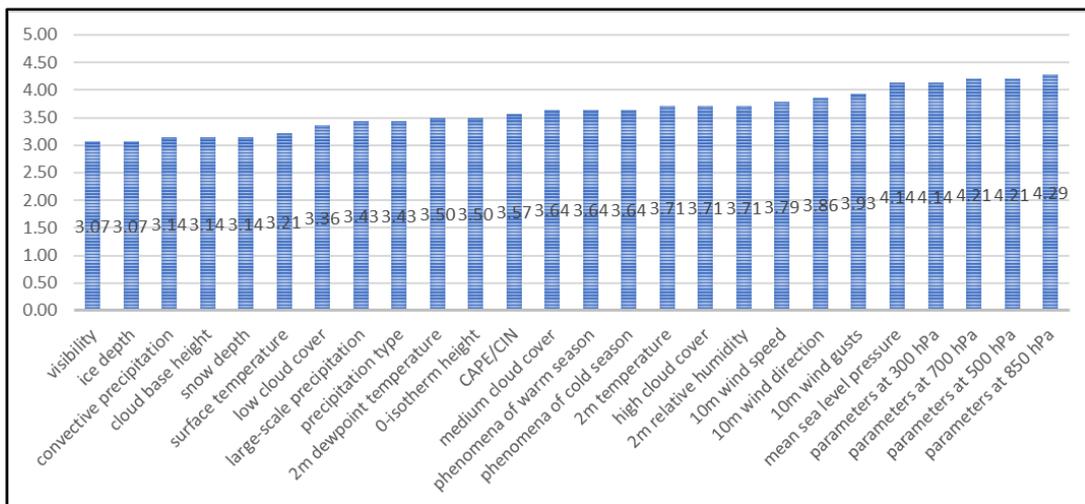


Figure 13: Summary of feedback from 14 Estonian forecasters on the quality of ECMWF forecast parameters: 1=“very bad” to 5=“very good”. Means are shown, ranked, so left is worse and right is better.

3.1.7. *Forecaster Impact*

Croatia and Hungary illustrate forecaster performance, compared to various global models and LAMs and ensembles, for maximum and minimum temperatures predictions for sites within their respective countries. In each case the forecasters perform, on average, better than all the other models. For Croatia the forecasts are just for day 2; for Hungary they are for days 1 to 6. For Hungary the forecaster achieves accuracy on day 5 that is, on average, on a par with model forecasts for days 2-4, with more added value shown for minimum temperature. No post-processed or blended forecasts are included in the comparisons.

### 3.2. Post-processed Products and End Products delivered to users

Portugal describe a simple but effective system for blending post-processed HRES forecasts at short leads with post-processed ENS mean forecasts at longer leads, for temperature at 700 Portuguese sites. The system achieves both seamlessness and accuracy, with just a minor accuracy penalty introduced, to achieve the seamlessness, during the blending stage. This is nicely illustrated in Figure 14 where the final output (STA, pink) is derived from the green post-processed HRES forecasts on day 1, and the blue post-processed ensemble mean forecasts from day 5, and a mix of the two (with tapered weighting) in-between. Only on days 3 and 4 are the RMSEs of STA (slightly) above the most accurate forecast component.

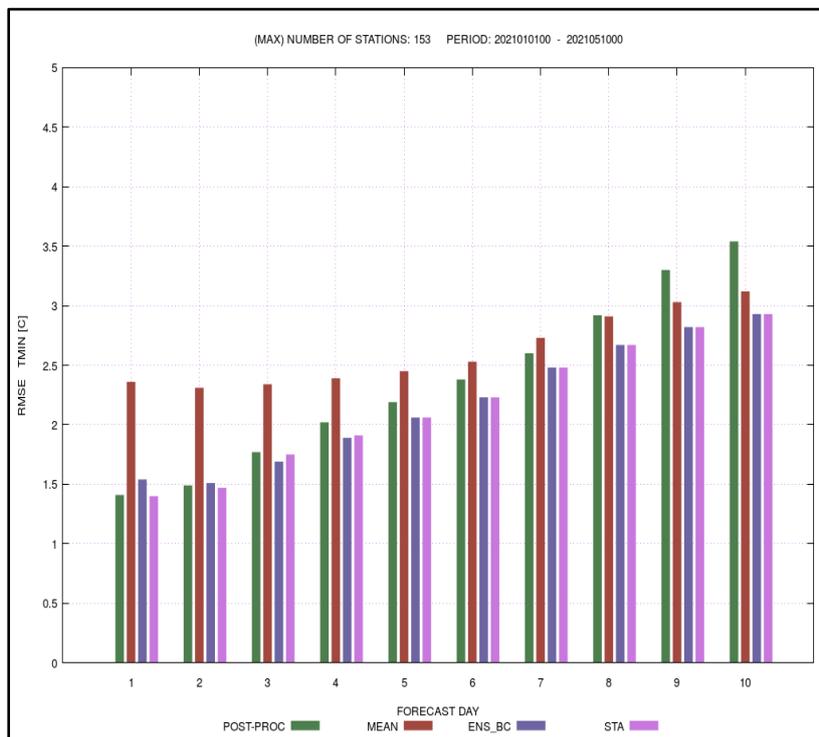


Figure 14: Accuracy of the various components in Portugal’s post-processing and blending system. POST-PROC comes from post-processing HRES, MEAN is the ensemble mean value, ENS\_BC is the ensemble mean post-processed, STA is the final output.

Iceland show how their 10m wind post-processing system, illustrated on Figure 5, achieves the desired speed-dependant bias-correction. And importantly, dangerously high speeds (>20m/s) are (correctly) predicted to occur far more often than in raw HRES output.

Germany report that their MOSMIX (combined product of ICON-MOS and ECMWF-MOS) point forecasts show clear advantages of post-processed and combined products (including ECMWF data), especially for continuous parameters like temperature (less so for precipitation and wind gusts).

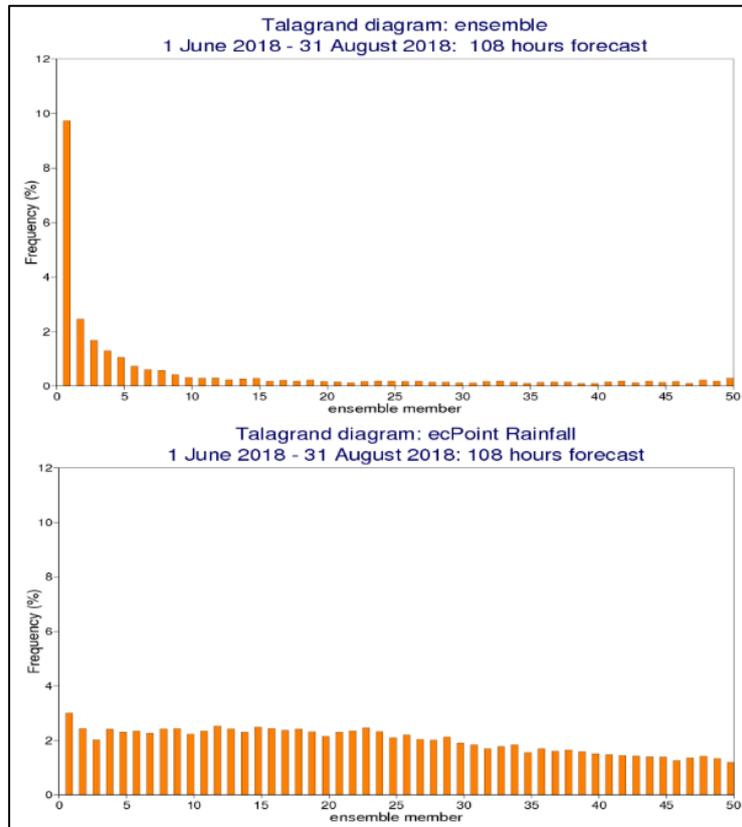


Figure 15: Talagrand diagrams for 12h rainfall forecasts ( $T+96-108$ ) verified at gauge sites over Hungary for Jun-Aug 2018: top shows raw ECMWF ENS, bottom shows ecPoint forecasts. Nearest gridpoint method used.

Referring to ECMWF’s post-processed ecPoint output, Hungary say this outperforms the raw ENS - e.g. see Talagrand diagrams in Figure 15. Meanwhile Switzerland report on a collaborative project with ECMWF where ecPoint was compared with the COSMO limited area ensemble (running up to 120h), with and without gEMOS post-processing applied. They showed that while slightly worse than gEMOS for low thresholds, ecPoint outperformed, in terms of discrimination ability, all variants of gEMOS for higher rainfall thresholds, most notably for longer leads.

Looking now to broadscale patterns, The UK Met Office again verify the weather regimes from their “DECIDER” classification system (reference Figure 6) applied to ENS forecasts over a 4½ year period. One key result is that there is some predictive skill for regimes out to about 15 days in winter, but only 11 or 12 days in summer.

The UK also clearly demonstrate (again) the benefits of multi-model (ensemble) forecasting for tropical cyclone activity, all around the world (Figure 16). In every basin the multi-model forecasts score better than any of the three ensembles that they are built from: ENS, MOGREPS (UK) and GEFS (US).

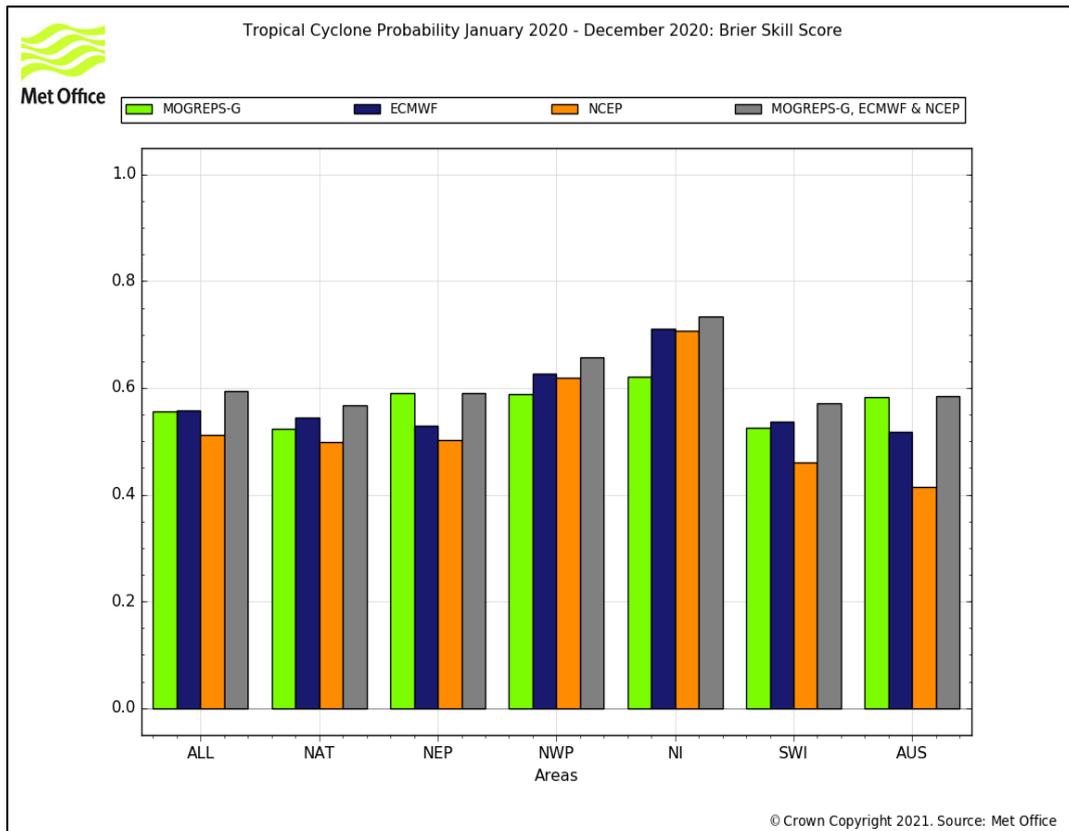


Figure 16: Brier Skill Score of UK (green), ECMWF (blue), US (orange) and multi-model (3 combined, grey) ensemble forecasts of storm track strike probability, for named tropical storms, for January to December 2020, split by basin (NAT=North Atlantic, NEP=North East Pacific, NWP=North West Pacific, NI=North Indian, SWI=South West Indian, AUS=Australian).

### 3.3. Extended Range (Monthly) and Seasonal Forecasts

It is evident that NMS skill expectations for monthly and seasonal forecast range from realistic to optimistic. On balance users are on average probably hoping for too much, given the current status, and maybe the detailed analysis of individual seasonal forecasts in some reports is evidence of this. As Portugal put it, “verification results are key”, which we take to mean multi-forecast verification, and which we strongly support. Indeed, the importance to users of (longer term) verification came through strongly in ECMWF’s 2021 user survey for extended range graphical products: 80% of respondents said they would like more/better verification measures. The fact is that extended range forecast skill beyond week 2 for temperature, and beyond week 1 for rainfall, is rather low. And seasonal forecast skill is also low; some skill is apparent for temperature, as seen even out to month 6 in Hungary’s results, but at the same time it is difficult to disentangle such skill from a climate change warming signal (as noted also by Croatia and Israel). Hungary’s result that predictions of maximum temperatures in seasonal forecasts had much more skill than predictions of minima, in 2020, is also interesting.

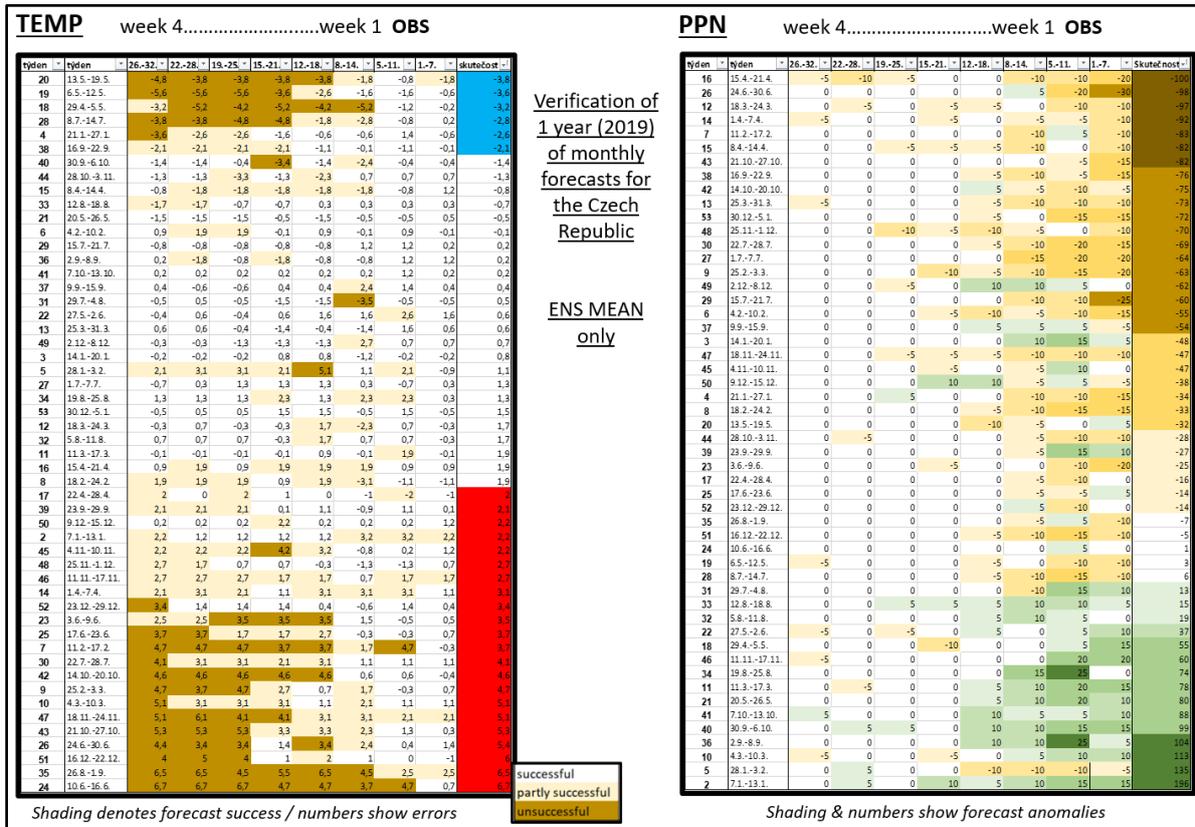


Figure 17: Tabulated verification for 1 year (2019) of temperature (left table) and rainfall anomaly (right table) forecasts for the Czech Republic. Each row denotes a forecast, re-ordered top to bottom by the value of the verifying anomaly (final columns), for which the value is shown in deg C (left) or mm (right). Blue is cold, red is warm, brown is dry, green is wet. On each table actual forecasts, in the central columns, are shown by numbers, with longer lead forecasts on the left and shorter leads on the right (see labelling at top). On the temperature table the numbers denote the errors (+ve values mean too cold), whilst on the precipitation table the numbers show the predicted anomaly. Cell colour shading then indicates just good or bad on the left table (see legend), whilst on the right table it just reflects the anomaly forecast. So, for a good forecast one wants white on the left panel, and colour matching on the right panel (versus the rightmost column).

Nicely presented results from the Czech Republic, for a central European verification domain, illustrate quite clearly the predictability difficulties for monthly forecasts (Figure 17). Careful study of this shows that large anomalies are not foreseen much in advance in the ensemble mean, for either temperature (up to ~2 weeks) or precipitation (up to ~1 week). Perhaps a fairer comparison would make use of the full ENS forecast distribution, as ECMWF now provides in CDF format, but on the other hand the ensemble mean charts may be all that most users ordinarily look at.

Some wide-ranging views, reflecting usage, expectations and experiences, for monthly forecasts (M) and seasonal forecasts (S) can also be illustrated with a sequence of quotes (sometimes paraphrased):

“M are jumpy” (Croatia), “M & S can’t be highly trusted” (Estonia), “S are heavily used” (Latvia), “M & S are not used much but interest is growing” (Austria), “Neither M nor S are used operationally” (Greece), “Confidence in S showing a warm spring was misplaced” (Croatia), “Would like to see S for visibility” (Italy), “S for winter-time rainfall are of particular concern” (Israel).

Seven countries talk about the importance of applications in the hydrological sphere, with The Netherlands and Romania referencing droughts, Germany referencing soil moisture, and Finland and Romania referencing agricultural needs.

It was nice to see Ireland report that they routinely use C3S multi-model output for seasonal forecasts. These are available as open access products on a Copernicus platform (see: [https://climate.copernicus.eu/charts/c3s\\_seasonal/](https://climate.copernicus.eu/charts/c3s_seasonal/)), and we would encourage other users to consider adopting a similar approach.

It is also clear that some countries have very specific requirements. Finland highlight how 80-90% of their imports arrive by sea. Accordingly, sea ice forecasts for the Baltic for winter (monthly and seasonal) are critical for them, because of the need to use ice breaker vessels to ensure free passage.

Both Croatia and the UK refer to the utility of regime forecasts in extended range output, and the UK illustrate how their own UK-specific 8-type regime classification scheme compares with the broader-scale 4-type scheme of ECMWF.

Croatia also discuss the importance of working with anomalies rather than absolute values when examining and verifying longer-range forecasts. Even if drift behaviour in monthly forecasts is not that great nowadays this is a strategy we would support, and indeed it underpins the use of anomalies in ECMWFs monthly and seasonal products.

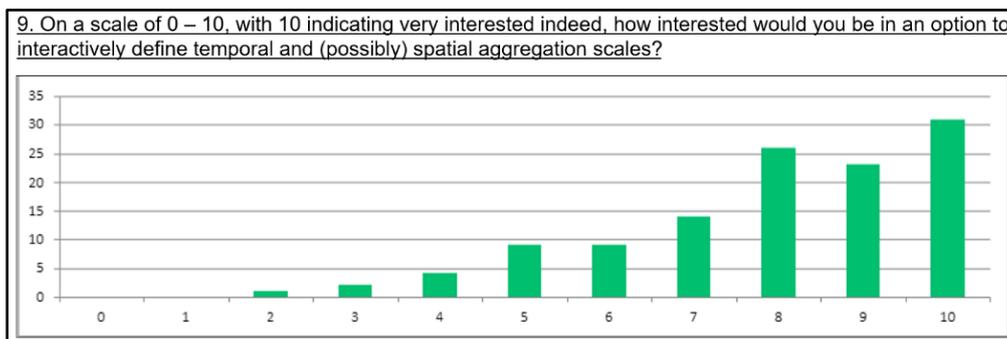


Figure 18: Responses to question 9 (see title) in the 2021 survey of extended range graphical product users, from the presentation of all survey results available here: [https://events.ecmwf.int/event/220/contributions/2186/attachments/1238/2287/UEF2021-HewsonExtended\\_range\\_products\\_survey.pdf](https://events.ecmwf.int/event/220/contributions/2186/attachments/1238/2287/UEF2021-HewsonExtended_range_products_survey.pdf)

Finally we note that Serbia have created their own Python modules to deliver monthly forecast products for user-defined periods and areas. This reflects the fact that our fixed-calendar-week periods are limiting for many customers - e.g. for those only interested in weekdays. Indeed this tallies with another clear outcome of the 2021 Extended Range Products Survey: Figure 18 highlights a strong desire for

alternative aggregation options. ECMWF will be looking into such product tailoring options in the coming years. Resource limitations may prevent us from making multi-period output widely available, and a general-purpose cloud-based tool might be the best alternative.

### 3.4. Case Studies

Many reports refer to cases that have been of particular interest (examined in varying levels of detail). These have been put into categories on Table 1, to give an idea of some of the NMS priority areas. Three cases (starred) are discussed further below (please refer to individual reports for the others).

Type of case	Count
Extreme Rain / Thunderstorms / Floods *	7
Heatwaves	5 (all noted by Lithuania)
Cyclonic Windstorm *	4
Snow	3
Hailstorm	3
Late frosts	2
Medicane	2 (same event)
Sea fog	2
Low cloud	2
Freezing rain	1
Orographic rain	1
Dry when rain “promised”	1
Wave heights	1
Dry thunderstorm for fire ignition *	1

Table 1: A manual classification of the case studies referenced in NMS ‘green book’ reports in 2021.

*Red stars relate to cases further discussed below.*

In their report Luxembourg highlighted a windstorm event on 9<sup>th</sup>-10<sup>th</sup> February 2020, for which HRES and ENS significantly over-predicted gust strengths. In cycle 47r3, being introduced operationally in October 2021, the gust parametrisation is changed, such that forecast gusts will be generally lighter, particularly in certain situations. So ECMWF used the cited event as a test case, by rerunning a short range HRES forecast with the new model version. On Figure 19 the forecast gusts of the operational forecast (cycle 46r1) are compared with those of 47r3, also showing observations. Evidently gust levels are less in the new cycle, and are widely in better agreement with observed values, including areas in and around Luxembourg.

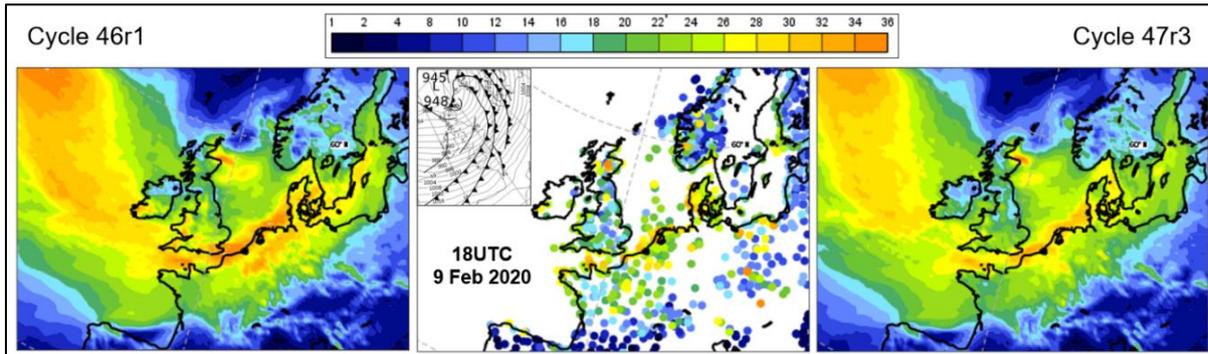


Figure 19: 18h forecasts of gust strength from HRES, valid 18UTC 9 Feb 2020, using cycle 46r1 (left) operational at the time, and cycle 47r3 (right). Observations are also shown, along with a segment of a Met Office synoptic chart for the same time. The scale is in m/s.

France refer to extreme rainfall (locally >500mm/24h), that was accompanied by devastating flash flooding, in a region northwest of Montpellier on 19<sup>th</sup> Sep 2020, and show sequences of forecasts for the event in the lead up, from HRES, ENS (as 90<sup>th</sup> percentile) and their convection-resolving model AROME-IFS (that uses ECMWF boundary conditions). The forecasts were a mixture of good and bad. France report that on the plus side there were signs of a potential event more than 10 days in advance, which is a remarkably long lead time, although flip-flop behaviour then followed in the IFS models' forecasts. Overall, all referenced model versions badly underestimated the amounts, on scales that should have been resolvable (the area of 300-500mm measures about 30km by 60km), although Arome-IFS was a bit better than HRES, for amounts and location. Figure 20 compares some forecasts with a lead time of 24-48h with observations. At ECMWF we do notice, from time to time, extreme rainfall events like this one, occurring on scales that should be resolvable, for which IFS forecast totals fall well short of the observed amounts. The extraordinary rainfall in Zhengzhou in China in July 2021 was another example. It is an enduring mystery as to how this apparent bias occurs; the moisture budgets for such events are not yet fully understood.

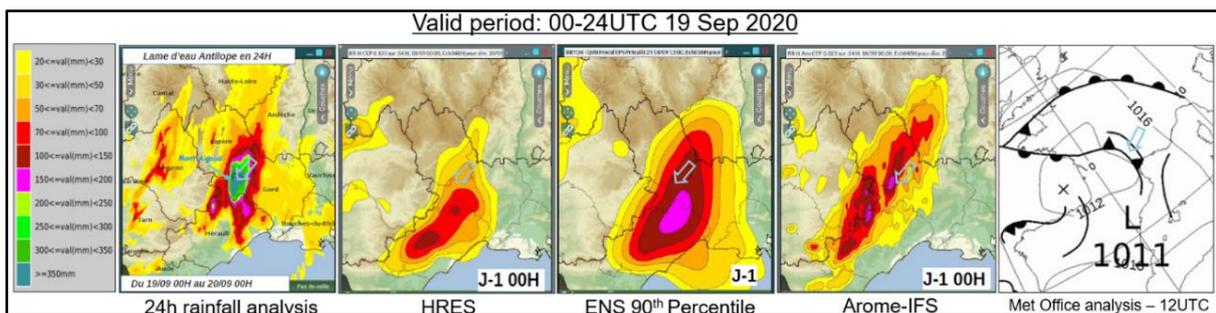


Figure 20: Forecasts for a 24-48 hour lead of rainfall over part of southern France, valid 00-24UTC 19 September 2020, from different models (central 3 maps), with a verifying radar-and-gauge-based analysis (leftmost map) and a Met Office surface analysis (right). Arrows denote the observed precipitation maximum.

Portugal refer to the responsibilities they have in “The Forest Fire Hazard ARISTOTLE-eENHSP” service (see <http://aristotle.ingv.it/tiki-index.php>). Similarly, they refer to a case study of forest fires being ignited by lightning from dry thunderstorms in Portugal, demonstrating new products based on ECMWF output that they are developing (Figure 21). The aim here is to combine probabilistic lightning forecasts with probabilistic precipitation forecasts from the IFS to help anticipate the level of risk of natural fire ignitions.

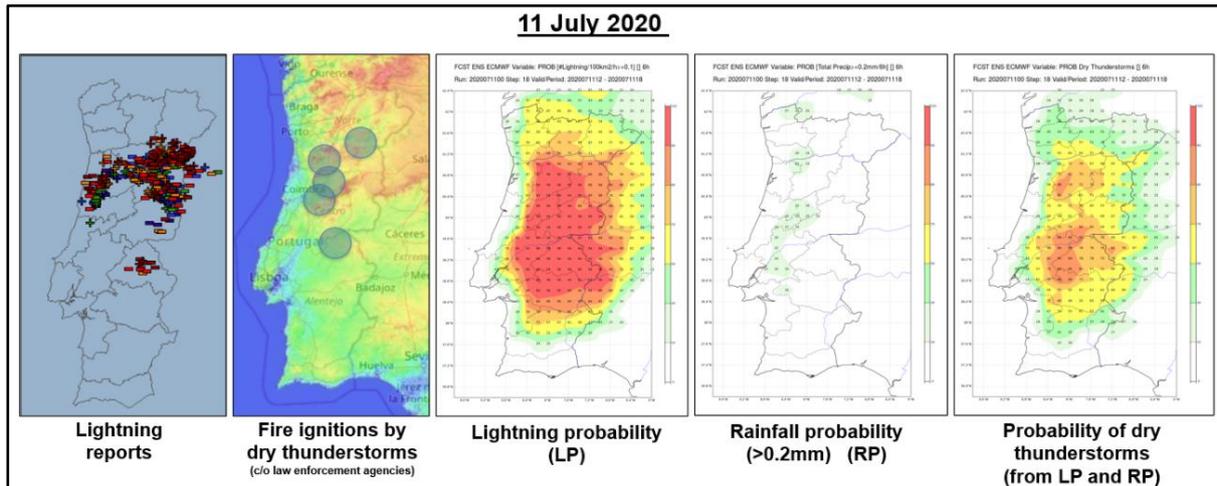


Figure 21: Observations (left two panels) and ENS forecasts for a 12-18 hour lead (right 3 panels) related to cases of terrestrial fire ignition by dry thunderstorms on 11 July 2020 (see panel labels).

#### 4. Requests for Additional Output

Requests for additional output have been as numerous as ever, through the pre-UEF2021 questionnaire, in the member and co-operating state visits, and also in the Green Book reports. This year, to try to cover all inputs in a simple, intelligible way, we took the related slides presented at UEF, updated and adjusted them using input from the other two fora, excluded those items that had already been satisfied, and reproduced the result in Appendix 1. No feedback is provided there on viability, but wherever possible ECMWF is actively considering these requests. Some will even be satisfied in cycle 47r3.

#### References

NMS Reports that contributed to this technical memorandum:

[https://www.ecmwf.int/en/publications/search?secondary\\_title=%22Green%20Book%202021%22](https://www.ecmwf.int/en/publications/search?secondary_title=%22Green%20Book%202021%22)

Presentations and Recordings from the 2021 UEF meeting:

<https://events.ecmwf.int/event/220/timetable/>

ECMWF Technical Memoranda:

[https://www.ecmwf.int/en/publications/search?solrsort=ts\\_biblio\\_year%20desc&f%5B0%5D=sm\\_biblio\\_type%3ATechnical%20memorandum](https://www.ecmwf.int/en/publications/search?solrsort=ts_biblio_year%20desc&f%5B0%5D=sm_biblio_type%3ATechnical%20memorandum)

The ECMWF “Forecast User” portal:

<https://confluence.ecmwf.int/display/FCST/Forecast+User+Portal>

ECMWF’s online Forecast User Guide:

<https://confluence.ecmwf.int/display/FUG/Forecast+User+Guide>

Known IFS forecast issues:

<https://confluence.ecmwf.int/display/FCST/Known+IFS+forecasting+issues>

## Appendix 1

User request summaries, adapted from UEF2021 slides, are shown in Figure A1.

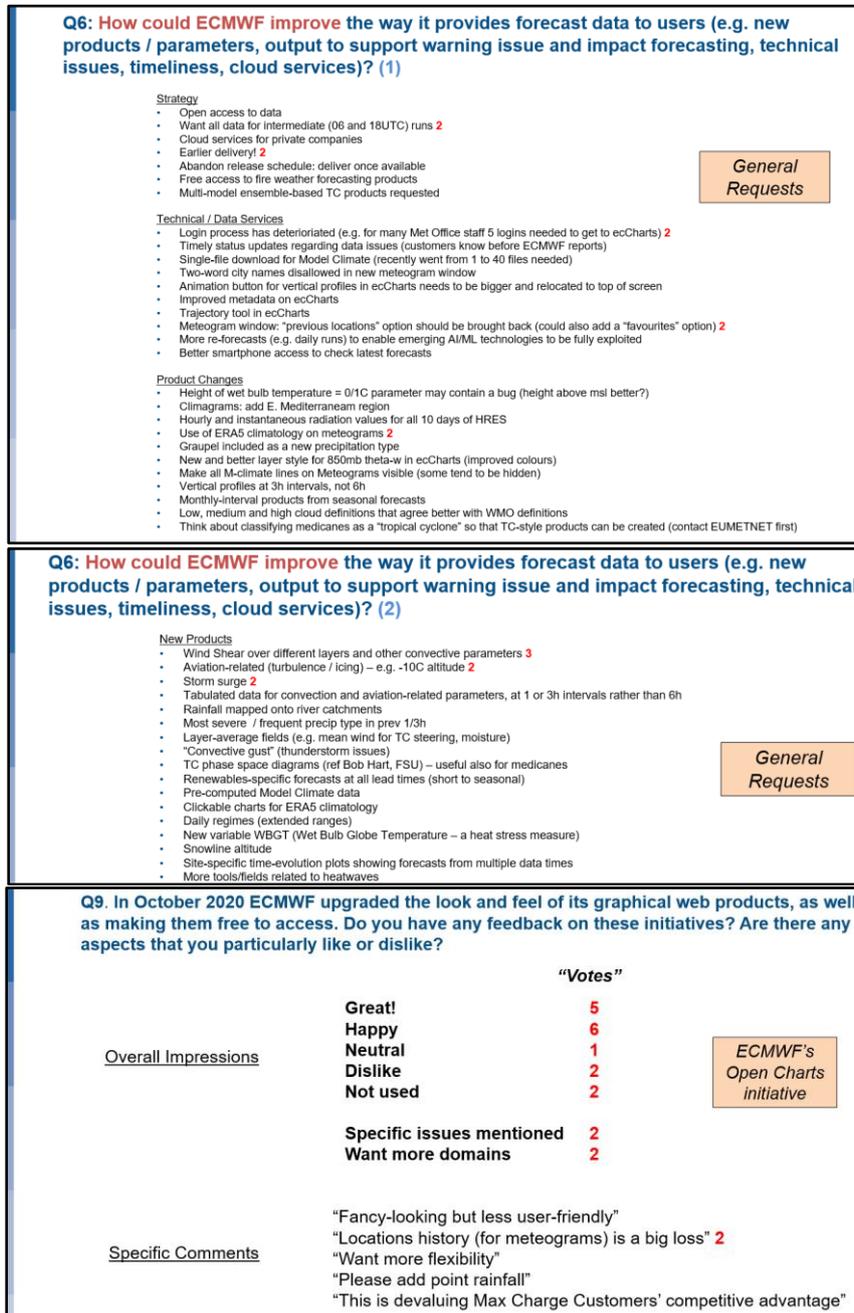


Figure A1: A summary of recent product/output-related requests from ECMWF users (top two panels), and a summary of feedback on the ECMWF Open Charts initiative (bottom panel), adapted from a presentation given at EWCMWF's 2021 UEF meeting.