

The EU-FP7 ERA-CLIM2 project contribution to advancing science and production of Earth-system climate reanalyses

Roberto Buizza, Stefan Brönnimann, Leopold Haimberger, Patrick Laloyaux, Matthew J. Martin, Manuel Fuentes, Magdalena Alonso-Balmaseda, Andrea Becker, Michael Blaschek, Per Dahlgren, et al.

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38

39 Capsule Summary

- 40 The main goals and activities of the ERA-CLIM2 project are presented, and some of its key
- 41 results, included the first ensemble of coupled reanalysis of the 20th century, are discussed.

43 Abstract

44 ERA-CLIM2 is a European Union Seventh Framework Project started in January 2014. It aims to produce coupled reanalyses, which are physically consistent data sets describing the 45 46 evolution of the global atmosphere, ocean, land-surface, cryosphere and the carbon cycle. ERA-CLIM2 has contributed to advancing the capacity for producing state-of-the-art climate 47 reanalyses that extend back to the early 20th century. It has led to the generation of the first 48 ensemble of coupled ocean, sea-ice, land and atmosphere reanalyses of the 20th century. The 49 50 project has funded work to rescue and prepare observations, and to advance the dataassimilation systems required to generate operational reanalyses, such as the ones planned by 51 52 the European Union Copernicus Climate Change Service. This paper summarizes the main goals of the project, discusses some of its main areas of activities, and presents some of its 53 54 key results.

56 1. The ERA-CLIM2 project

57 ERA-CLIM2 (European Reanalysis of Global Climate Observations 2) is a 4-year research project funded by the European Union Seventh Framework Program (EU FP7; Grant 58 59 Agreement No. 607029; see Appendix for a list of the Consortium's Institutions), that started 60 on the 1st of January 2014 following the successful completion of its predecessor project 61 ERA-CLIM. The research initiated in these two projects underpins a concerted effort in 62 Europe to build the information infrastructure needed to support climate monitoring, climate 63 research and climate services, based on the best available science and observations. ERA-64 CLIM2 is one of several collaborative research projects designated by the European 65 Commission as precursors to the EU's Copernicus Climate Change Service (C3S). Indeed, 66 ERA-CLIM2 activities on data rescue, satellite data rescue and reprocessing, coupled data 67 assimilation and reanalysis production have had a strong impact on the design and 68 implementation of the C3S. Furthermore, activities performed in ERA-CLIM2 and aiming at 69 improving the assimilation of observations at inter-medium boundaries, i.e. sea surface 70 temperature and sea-ice concentration observations, will certainly benefit ocean and sea-ice 71 reanalyses and operational marine forecast activities performed within the EU's Copernicus 72 Marine Environment Monitoring Service (CMEMS).

73 The aim of the ERA-CLIM2 project is to enable production of state-of-the-art reanalyses of the coupled climate system for the 20th century, following earlier work on coupled and long-74 75 term climate reanalysis at the National Center for Atmospheric Research and the National 76 Centers for Environmental Predictions (NCAR and NCEP; Saha et al., 2010, Compo et al., 77 2011), and the European Centre for Medium-Range Weather Forecasts (ECMWF) strategy 78 described in a previous BAMS article (Dee et al., 2014). Climate reanalyses are physically 79 consistent data sets derived from observations that document the recent evolution of the 80 global atmosphere, ocean, land-surface, cryosphere and the carbon cycle. Reanalysis data are

generated by a sequential process called data assimilation, which combines first-guess
estimates defined by short model forecasts with vast amounts of data from a range of
observing platforms (surface, upper-air, satellites). Climate reanalyses provide long (multidecadal) time series of gridded estimates for many different climate variables, which are used
to study past weather events, estimate climatologies, monitor climate change, and supply
crucial data on climate needed for science and applications.

87 Reanalysis is a complex activity that requires large computational resources, access to 88 observations from many providers, and expertise in multiple disciplines. During the past three decades, successive reanalyses of the global atmosphere have been produced by NCAR and 89 90 NCEP (Kalnay et al., 2006, Saha et al., 2010), the Japan Meteorological Agency (JMA; 91 Onogi et al., 2007), and the National Aeronautics and Space Administration (NASA; 92 Schubert et al., 1993, Rienecker et al., 2011), in addition to ECMWF. A global reanalysis 93 extending back to the late nineteenth century was first produced by NOAA in collaboration 94 with the Cooperative Institute for Research in Environmental Sciences (CIRES), using only 95 surface pressure observations and prior estimates of sea-surface temperature (SST) and sea-96 ice distributions to avoid the effects that large changes in the observing system could have 97 had on the reanalysis (Compo et al., 2011).

98 ERA-CLIM2 has contributed to advancing reanalysis science and development in four main99 areas:

i. Observation data rescue and post-processing: activities under this theme include a
large effort on data rescue for historic in-situ weather observations around the world,
and substantial work on the reprocessing of satellite climate data records and enabling
the use of historical satellite data for reanalysis;

104 ii. *Data assimilation methods*: activities under this theme aim to progress the
105 development and testing of 'coupled assimilation methods', capable of including
106 observations from different Earth-system components (land surface, ocean, sea-ice,
107 atmosphere, chemical components, ...) to produce a more consistent estimate of the
108 Earth-system evolution, especially at the surface;

- 109 iii. *Reanalysis production*: activities under this theme aim to generate the innovative
 110 reanalysis data-sets, such as the first European coupled ocean-land-atmosphere
- 111 reanalysis of the 20th century, and to provide access to the reanalysis data;

112 iv. *Evaluation and uncertainty estimation*: activities under this theme aim to assess the

- reanalyses' quality and how products differ from previous uncoupled products, and to
- develop methods for estimating uncertainty in reanalyses.
- 115 Hereafter, we will discuss briefly some of these activities.

116

117 2. Reanalysis as a tool to monitor the climate

118 The Earth's climate has traditionally been studied by statistical analysis of observations of 119 particular weather elements such as pressure, temperature, wind and rainfall. These 120 meteorological observations are temporally and spatially incomplete and are often presented 121 in terms of long-term averages to identify evidence of climate change. Reanalyses provide a 122 more complete source of data to understand and monitor the climate. In a reanalysis, the 123 weather observations collected in past decades are fed into a modern forecasting system 124 designed to assimilate observations from existing and planned platforms (e.g. forthcoming 125 satellite instruments), which provides a physically consistent description of the Earth system. 126 By constantly correcting a model simulation towards the observations, a reanalysis combines 127 the advantages of the model first guess and the available data (further details in section 4). 128 Therefore, reanalyses are physically consistent, spatially complete and encompass many

129 variables for which observations are not always available. Irregular and intermittent

130 observation sampling throughout the reanalysis period, especially during early periods, might

131 however prevent the reanalysis dataset from showing temporal homogeneity at both global

132 and regional scale (e.g. *Ferguson and Villarini*, 2012; see also Section 7).

133 Since its creation in 1975, ECMWF has been a key player in the production of reanalyses.

134 The initial focus was on producing atmospheric reanalyses covering the modern observing

135 period, from 1979. The first of these reanalyses, FGGE (First GARP Global Experiment,

136 where GARP stands for <u>Global Atmospheric Research Program</u>), was produced in the 1980s

137 at the Geophysical Fluid Laboratories (GFDL; *Ploshay et al.*, 1992), followed by ERA-15

138 (European Reanalysis, version 15-years), ERA-40 (Uppala et al., 2005) and ERA-Interim

139 (Dee et al., 2011). The next reanalysis in this series, ERA5, is now in production after many

140 years of research and development.

141 Generating a reanalysis for climate monitoring is very challenging because it needs to be 142 extended further back in time when the observing system was very sparse, especially before 143 the availability of satellite data from the 1970s onwards, and even more so before the arrival 144 of radiosonde measurements in the 1930s. To tackle the unavoidable issue of the ever-145 changing observational network, the European Union started the ERA-CLIM (European 146 Reanalysis of Global Climate Observations) project, to investigate data selection for reanalyses covering the whole 20th century. As part of the ERA-CLIM project, ECMWF 147 148 produced the uncoupled atmospheric reanalysis ERA-20C, which covers the period January 149 1900 to December 2010 (Poli et al., 2016). The ERA-20C reanalysis assimilated only 150 conventional observations of surface pressure and marine wind, obtained from well-151 established climate data collections. ERA-20C delivered three-hourly products describing the 152 spatial and temporal evolution of the atmosphere, land surface and waves.

153 As part of the FP7 ERA-CLIM2 project, the reanalysis capabilities developed in the ERA-154 CLIM project have been extended to the ocean and sea-ice components. A new assimilation 155 system (CERA, the Coupled European Reanalysis system) has been developed to 156 simultaneously ingest atmospheric and ocean observations in the coupled Earth system model 157 used for ECMWF's ensemble forecasts (Laloyaux et al., 2016, 2017). This approach accounts 158 for interactions between the atmosphere and the ocean during the assimilation process and 159 has the potential to generate a more balanced and consistent Earth system climate 160 reconstruction (Figure 1). CERA has also been found to reproduce better the observed 161 negative SST-precipitation relationships on monthly timescales due to the resolving of 162 atmospheric feedbacks on SST (Figure 2). Efforts are being made to investigate whether this 163 improvement will improve the prediction of final precipitation (Feng et al., 2017b). One of 164 the key deliverables of the ERA-CLIM2 project is CERA-20C, the first ten-member ensemble of coupled climate reanalyses of the 20th century. It is based on the CERA system, 165 166 which assimilates only surface pressure and marine wind observations as well as ocean 167 temperature and salinity profiles. The data are openly available from the ECMWF platform 168 http://apps.ecmwf.int/datasets/.

There is now a strong need for detailed information of CO2 fluxes and carbon pools from the climate modelling community who want to understand and quantify the carbon cycle at global and regional scales, and from policy makers and citizens who want to take wellinformed decisions on CO2 emissions at regional and local scales. For this reason, ERA-CLIM2 is also producing associated global reanalyses of carbon fluxes and stocks using terrestrial biosphere and ocean biogeochemistry models, which are forced by the CERA-20C reanalysis.

A new version of the CERA system has also been developed based on a higher resolutioncoupled model with the full observing system. This system is now used to produce the

178 CERA-SAT (the <u>Coupled European ReAnalysis of the SAT</u>ellite era) reanalysis which covers
179 the period 2008-2016.

The availability of atmospheric, oceanic and coupled reanalyses allows for new advanced coupled diagnostics of the global energy cycle. *Mayer et al.* (2017) improved the classic method of evaluating the vertically integrated atmospheric energy budget such that it is independent of reference temperature and consistent with diagnosed ocean heat budgets. *Pietschnig et al.* (2017) demonstrated the value of comparing the net energy transport through all major Arctic Ocean gateways from ocean reanalyses with independent mass-consistent transport estimates from instrumented mooring observations.

187

188 3. Observation data rescue

189 Reanalyses efforts strongly depend on observations of the atmosphere, land surface, the 190 ocean and cryosphere. Observations are assimilated into a coupled general circulation model 191 in order to produce the reanalysis, but observations are also used in several other steps. They 192 are used to constrain the boundary conditions, to calibrate certain relations and to validate the 193 final product. Particularly when going back in time, not all observations are available. A large 194 fraction of historical meteorological observations has never been digitised because the data 195 have thus far not been considered valuable. Even in the rather recent past, the availability of 196 satellite products (and the computer code to read and process these data) is an issue that needs 197 to be addressed.

198 Major efforts were therefore undertaken in ERA-CLIM2 to collect and make available

199 observations for reanalyses (*Brönnimann et al.*, 2017). Such an undertaking requires a much

200 broader vision than the production of one reanalysis. Availability of historical observations

becomes a legacy, and producing reanalyses or other data products must be seen as acontinuous effort.

203 Within ERA-CLIM2, millions of radiosonde, pilot balloon and other ascending instruments' 204 profiles were digitised, which allows describing the third dimension of the atmosphere back to the early 20th century. Although the radiosonde data were not yet incorporated into the 205 CERA-20C reanalysis produced in ERA-CLIM2, they were used for the validation of 206 207 reanalysis products. A test reanalysis that included the historical upper-air data and 208 demonstrated the potential benefits was performed for the period 1939-1967 (Hersbach et al., 209 2017). By the end of the project, all digitized upper air data will be available in assimilation-210 ready format with bias adjustments for radiosonde temperatures (Haimberger et al., 2012) 211 extending back to 1939. Future reanalysis efforts will be able to incorporate this vast amount 212 of upper-air data and will thus build on the ERA-CLIM2 efforts.

213 Surface pressure and mean-sea-level-pressure data were also digitised for several countries in 214 both the Northern and Southern Hemisphere (NH and SH), some with sparse observation 215 networks, and sent to the International Surface Pressure Databank (ISPD). These will be 216 assimilated in forthcoming ISPD versions to be used in future reanalyses inputs. Many other 217 land surface, daily and sub-daily, observations of temperature, relative humidity, surface 218 wind, cloud cover, precipitation, evaporation and sunshine duration were rescued, subjected 219 to Quality Control procedures and can be used for reanalyses comparison purposes 220 (Brönnimann et al., 2017).

Snow is an important component of the climate system, at the interface of the land-surface, vegetation and atmosphere. It is highly relevant for various fields such as ecology, water resources, transport, and tourism. By digitising large amounts of historical snow data and combining this with satellite products, ERA-CLIM2 generated snow products for various

uses, including (but not limited to) reanalyses. Snow courses are specified paths of a few km
length around a location: along this path, different snow properties are measured regularly.
Thanks to ERA-CLIM2, snow course about 1.2 million snow course observations have been
collected from close to 400 stations compiled and made available.

229 Satellite data are the backbone of today's reanalysis data sets, but they became only available 230 in the mid-1960s and were built for the purpose of weather monitoring. The use in reanalysis 231 requires a quantification and correction of long term effects due to systematic differences 232 between satellite instruments of the same kind and changes in the characteristics of satellites 233 and performance of sensors during their operational lifetime in space. A reprocessing of the 234 data that applies the corrections is fundamental to serve the generation of physically 235 consistent data records of geophysical variables by reanalysis. In ERA-CLIM2, efforts were 236 put into re-processing of satellite data of infrared and microwave radiances from 237 geostationary imagers and microwave sounders, radio occultation bending angle profiles for 238 several satellites and atmospheric motion vectors from different instruments in geostationary 239 and polar orbit. In addition, as part of satellite data rescue activities (*Poli et al., 2017*) 240 radiative transfer calculations for some early satellite instruments were enabled to allow for 241 monitoring and assimilation of the satellite measurements using the circulation model which 242 also supports the characterisation and correction of instrument issues. Indeed, a more comprehensive use of early satellite data is expected to improve future reanalyses. 243

244

245 4. Data assimilation methods for reanalysis

The ERA-CLIM2 reanalyses have been produced using a state-of-the-art data assimilation
system, capable of combining observations in the atmosphere and ocean with a coupled
ocean-land-atmosphere model. Part of the work within ERA-CLIM2 was devoted to improve

such a data-assimilation system, testing also new methods and ideas that could be used infuture reanalysis productions.

251 A crucial part of the coupled climate system is the interface between the ocean/sea-ice and 252 atmosphere (Feng et al., 2017). In the existing CERA system, the sea surface temperature is 253 constrained to follow a global observational analysis, such as HadISST2 (Titchner and 254 Rayner 2014) or OSTIA (Donlon et al. 2012), which are calculated externally. Enabling the 255 next CERA system to assimilate directly the wealth of high quality satellite SST observations 256 should allow the system to combine them with the temperature profile data and the coupled 257 model background in a more consistent manner, thereby improving the accuracy of the 258 reanalysis. Care has to be taken to deal properly with biases in the satellite data that could 259 otherwise introduce spurious trends. In addition, the in situ ocean data are sparse, particularly in the early part of the 20th Century. 260

Figure 3 shows an example of the results from using a new method for effectively spreading sparse observational information in the data assimilation. Developments have also been made to improve the assimilation of sea-ice concentration during the satellite era. Sea-ice concentration estimates have error characteristics which make it difficult to assimilate in most data assimilation algorithms so techniques have been tested which transform the sea-ice concentration into a form which has Gaussian errors.

The ocean data assimilation system used in CERA is a state-of-the-art three-dimensional
variational system called NEMOVAR (<u>N</u>ucleus for <u>E</u>uropean <u>M</u>odelling of the <u>O</u>cean
<u>Var</u>iational assimilation system). It is now a very flexible framework for assimilating data
into the NEMO ocean model, and includes developments to allow the ocean data to be
assimilated using sophisticated techniques similar to those used in the atmosphere (*Weaver et al.*, 2016). The system can now be configured to use information from an ensemble of model

273 runs to improve the assimilation, which is a more sophisticated system than the algorithm 274 used in the production of the ERA-CLIM2 reanalyses. In the present CERA system, the 275 ocean bias correct scheme is not applied during the ocean data assimilation as it normally 276 needs to be estimated from a priori run. However, now with CERA-20C being finished, it becomes practically possible to implement this scheme throughout the whole 20th century. 277 278 Implementing the bias correction scheme will avoid the ocean model to produce a spurious 279 reaction to adjust the imbalance between the ocean and atmosphere initial conditions. Efforts 280 are also being made to investigate if the implementation will benefit the atmosphere analysis. 281 Furthermore, a four-dimensional version of the ocean assimilation system has been developed 282 and is under testing.

283 Currently the coupled model is introduced at the outer-loop level in the CERA system by 284 coupling ECMWF's Integrated Forecasting System (IFS) for the atmosphere, land and waves 285 to the NEMO model for the ocean and to the LIM2 model for sea ice. This means that air-sea 286 interactions are continuously taken into account when observation misfits are computed and when the increments are applied to the initial condition. This allows feedback between the 287 288 ocean and atmosphere models (Laloyaux et al. 2016, 2017). Investigations into whether the 289 atmosphere observations could be used to directly correct the ocean model, and vice versa, 290 have been carried out in ERA-CLIM2 (Storto et al., 2017; Pellerej et al., 2016). This 291 technique, known as "strongly coupled data assimilation", could allow even better use of 292 sparse observations. There are many open research questions in the development of strongly 293 coupled data assimilation, so ERA-CLIM2 partners were involved in the organisation of a 294 Coupled Data Assimilation workshop in October 2016, sponsored by WMO, to discuss these 295 with the wider international research community.

Land and ocean carbon reanalyses are also being produced as part of ERA-CLIM2 and thetechniques used to produce them are being developed for use in future reanalyses. Various

new data streams have been tested for improving the accuracy of the land carbon reanalysis
both through improved state-estimation, and through improving knowledge of the model
parameters (*Peylin et al.*, 2016). The methods used to couple ocean biogeochemical models
to the physical ocean/atmosphere reanalysis system have also been investigated in order to
provide improved information about the ocean carbon cycle.

303

304 5. Reanalysis and society

305 ERA-CLIM2 demonstrated that reanalyses can be used to understand past events and provide 306 valuable information to present day society. A demonstration case was discussed by 307 Brugnara et al., (2017), who examined the weather conditions in December 1916, in the middle of the First World War, when a massive snow fall event in the Southern Alps 308 309 triggered countless avalanches, which killed thousands of soldiers and civilians. This event 310 was studied using dynamical downscaling of the earlier ERA-20C reanalysis (the uncoupled 311 reanalysis produced by the FP7 project ERA-CLIM, the precursor of ERA-CLIM2) in 312 combination with historical observations. By looking at reanalysis data (Figure 4), the 313 atmospheric conditions that led to such catastrophic events could be understood: a blocking 314 flow situation, moisture transport from the warm Mediterranean Sea towards the Alps, and a 315 rapidly rising snow line, leading to a dangerous "rain-on-snow" situation. Historical events 316 that are captured by the ERA-CLIM reanalyses can thus inform present day risk management.

317

318 6. A new approach: ensembles of reanalyses to estimate confidence

The accuracy of any physical measurement is limited. Furthermore, the spatial resolution of measurements and of assimilated gridded data is limited, and thus there may be deviations of the grid point values from the true values. Confidence (or uncertainty) is best described by

322 the probability distribution of these deviations. The distribution itself can be characterized by 323 a few parameters such as standard deviation, or by a limited-size ensemble of realizations 324 drawn from the distribution, from which the user may derive statistics. The latter approach 325 consumes much more data storage but also leaves more choices for informed users.

With reanalysis products getting more mature, it is now possible to quantify their accuracy
and assign to the reanalysis data a confidence level. In ERA-CLIM2, this has been achieved
by applying an ensemble approach, based on several complete realizations of all quantities.

Both the 20th century reanalysis CERA-20C, and the upcoming coupled reanalysis of the

330 satellite era, CERA-SAT, consist of ten realizations, run in parallel. The ten members can be

used to estimate a range of possible states for all the reanalysis output variables. They have

been generated using an Ensemble of Data Assimilation (EDA) in the atmosphere (Isaksen et

333 *al.* 2010; *Bonavita et al.* 2016) and with perturbing the positions of in-situ ocean

334 observations, the air-sea fluxes and the SST following ECMWF's Ocean ReAnalysis System-

5 (ORAS5) (*Zuo et al.* 2016). The SST perturbations lead to variations in important output

336 parameters such as surface precipitation. Figure 5 shows how CERA-20C precipitation has

improved over the earlier 20th century uncoupled reanalysis ERA-20C (*Poli et al.*, 2016) over

338 less well observed land areas, which exhibited a strong under-forecast at the higher quantiles

in Africa and at the Monsoon areas for the 0.9 quantiles (*Rustemeier et al.*, 2017). Figure 5

340 also shows how the calculated precipitation varies within the ensemble. For example, for

341 strong precipitation episodes over Africa (upper right of panel a) the spread has been

increased by about 20%, making the ensemble more reliable.

344 7. CERA-20C: the first European 110-year coupled ocean-land-atmosphere reanalysis 345 The accurate representation of variability on inter-annual and decadal time scales is a 346 requirement for climate applications of reanalysis data, such as reconstructing the time 347 evolution of the atmosphere surface temperature and of the ocean heat content (Figure 6). 348 Climate signals in reanalyses are inevitably affected by changes in the global observing 349 system and by the presence of time-varying biases in models and observations. To build 350 confidence in climate change information derived from reanalyses, it is important that 351 information about the data assimilation methodology, the forecast model, and the input 352 observations are made available. It is also necessary to compare results based on reanalyses 353 (ECMWF CERA-20C, NOAA 20CR, ECMWF ORA-20C), with results obtained using more 354 traditional, observation-only climate datasets (CRUTEM4 two-meter temperature, GPCC 355 precipitation data, EN4 ocean temperature), and to test whether the climate signals in CERA-356 20C are robust to different analysis methodologies. CERA-20C data are been made freely available from the ECMWF web site (see: https://www.ecmwf.int/en/research/climate-357 358 reanalysis/cera-20c) precisely to favour these comparisons.

359

360 8. Summary and conclusions

361 ERA-CLIM2 is a European Union Seventh Framework project started in January 2014,

362 which involves 17 organisations (see Appendix A). It aims to produce coupled reanalyses, i.e.

363 physically consistent data sets describing the evolution of the global atmosphere, ocean, land-

364 surface, cryosphere and the carbon cycle. The main contributions of the ERA-CLIM2 project

365 to climate science have been to rescue and re-process past conventional and satellite data,

366 improve the capacity for producing state-of-the-art climate reanalyses that extend back to the

367 early 20th century, along with uncertainties, and generate unique and extremely valuable data

368 sets. One of the main deliverables of ERA-CLIM2 has been CERA-20C, the first European coupled reanalysis of the 20th century. CERA-20C is now being used to generate a land 369 (water and energy) and a carbon (land and ocean) component (CERA-20C/Land and CERA-370 371 20C/Carbon). At the time of writing, the production of the CERA-SAT reanalysis has started: the aim is to complete the period 2008-to-date by the end of the project (December 2017). 372 373 Thanks to ERA-CLIM2, many older data have been rescued and post-processed, and are 374 delivered to relevant database providers so that they can be used in future reanalysis. 375 Furthermore, new assimilation methods (e.g. use of a stronger coupling method between the 376 ocean and the atmosphere and the direct assimilation of SST data) developed and tested 377 within the project are planned to be integrated and used in future reanalysis productions. 378 Understanding climate change is highly dependent on the availability of global satellite and 379 conventional observational data in the atmosphere, the land and the ocean and sea-ice, and 380 the development of coupled ocean-land-atmospheric models and assimilation systems that 381 can ingest these data. A continuous cycle of research and development activities in data-382 assimilation, of data rescue and observation re-processing, production and diagnosis and 383 evaluation is required to improve future reanalyses, so that they can provide a better, closer-384 to-reality image of the time evolution of the Earth system.

Here are two examples of why we need a continuous stream of investments in the two areasmentioned above:

Within ERA-CLIM2 millions of new observation records, mostly made before the
 International Geophysical Year 1958, have been discovered, rescued, digitized and
 prepared to be inserted in appropriate data sets so that they can be used in future
 reanalysis production. As this work has been progressing, new data are discovered,
 but unfortunately due to lack of resources and time (the project will finish at the end

of 2017), they will not be rescued, digitized, quality controlled and prepared to beinserted in the data sets.

As part of the ERA-CLIM2 work, the possibility to assimilate directly sea-surface
 temperature observations has been explored and tested in prototype systems.
 Furthermore, the possibility to use ensemble methods to estimate flow-dependent
 background error statistics within the ocean has been developed and tested. Neither of
 these advances could be included in the current ERA-CLIM2 reanalyses, since tested
 software was not ready in time for production.

400 Preliminary assimilation experiments have shown that the amount and quality of those data 401 justify a full reanalysis, using earlier satellite observations and all conventional (surface and upper-air) data, back to the early 20th century (*Hersbach et al.*, 2017). Such a reanalysis 402 403 would realize the potential of the data collected and would lead to a much better description 404 of the climate evolution over the last century. However, the only way to be able to continue 405 these essential activities would be to fund them either through a new stream of European 406 projects, or directly as part of the European Union Copernicus Climate Change Service (C3S) 407 activities.

408

410 9. Appendix A: the ERA-CLIM2 Consortium

411

- 412 The ERA-CLIM2 Consortium included 17 organisations:
- 413 1) European Centre for Medium-Range Weather Forecasts (ECMWF; Europe);
- 414 2) Met Office, UK (UKMO; UK);
- 415 3) European Organisation for the Exploitation of Meteorological Satellites (EUMETSAT;
- 416 Europe);
- 417 4) University of Bern (Switzerland);
- 418 5) University of Vienna (Austria);
- 419 6) Instituto Dom Luiz Faculdade de Ciências da Universidade de Lisboa (Portugal) ;
- 420 7) Russian Research Institute of Hydrometeorological Information (RIHMI; Russia);
- 421 8) Mercator Ocean Societé Civile (MERCATOR; France);
- 422 9) Météo-France (MF; France);
- 423 10) Deutscher Wetterdiens (DWD; Germany);
- 424 11) Centre European de Recherche et de Formation Avancée en Calcul Scientifique
- 425 (CERFACS; France);
- 426 12) Centro Euro-Mediterraneo Sui Cambiamenti Climatici (CMCC; Italy);
- 427 13) Ilmatieteen Laitos (FMI; Finland);
- 428 14) Universidad del Pacifico (Chile);
- 429 15) The University of Reading (UK);
- 430 16) Institut National de Recherche en Informatique et en Automatique (INRIA; France) ;
- 431 17) Université de Versailles Saint-Quentin-en-Yvelines (France).

433 **10. References**

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549 11. Figures captions

550 Figure 1. High-pass filtered sea surface temperature (colour) and wind stress (contour) for

551 ERA-20C (left) and CERA-20C (right) over the period 01/04/73 to 27/03/74. CERA-20C

represents the Tropical Instability Waves thanks to the ocean dynamics and the atmosphere is

553 responding accordingly with the surface wind stress sensitive to the ocean TIWs. In ERA-

554 20C, there are no TIWs and wind stress signals.

555

Figure 2. (a-c) SST-precipitation correlations for their monthly fluctuations in observational
data (HadISST2 and GPCP), ERA-20C and CERA-20C (control run), over 1979-2010. Blank
areas are where the correlations do not pass the significance test at the 90% confidence level.
Note the agreement between observations and CERA-20C in the heavily precipitating
regions.

561

Figure 3. Examples of sea surface temperature observations (left) and temperature profile
observations (right) in °C from Jan 1953 (top panels) and Jan 2010 (middle panels). The
bottom plot shows the percentage change in error in SST from assimilating the Jan 1953 data
using the new version of NEMOVAR.

566

567 Figure 4. Results from the dynamical downscaling of ERA-20C: (a) total precipitation

568 (shading) on 13 December 1916 and mean freezing level (grey contours; in m). (b) change in

- snow depth between 5 and 13 December 1916. Circles represent snow observations, red
- 570 crosses show the locations of documented major avalanches on this day. The military front
- 571 line in 1916 is shown as red dotted line.

573	Figure 5. Quantile-Quantile Plot of monthly regional mean short term precipitation forecasts
574	from ERA-20C (black) and CERA-20C (grey) against Full Data Monthly V7 (Schneider et
575	al., 2015)GPCC precipitation estimates from rain gauges provided by the Global Precipitation
576	Climatology Centre (GPCC). a) Africa, b) India/Monsoon region,, c) South America,. Time
577	interval considered: 1901-2000 on 1° spatial resolution, monthly temporal resolution.
578	
579	Figure 6. The two time series show the evolution of yearly global-mean anomalies relative to
580	the period 1961–1990 for the two-metre temperature (top) and the upper-ocean heat content

581 in CERA20C.

582

12. Figures









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