# Applications of coupled data assimilation at ECMWF

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## Climate reanalyses at ECMWF spanning 1900-2010

- $\rightarrow$  reconstruct the past weather (synoptic situation)
- → reconstruct climate (low-frequency variability)

ERA-20C: the ECMWF atmospheric reanalysis of the 20th century



Atmosphere

Land



ORA-20C: the ECMWF ocean reanalysis of the 20th century



Ocean

Sea ice

#### CERA-20C: the first ECMWF coupled ensemble reanalysis of the 20th century



**Atmosphere** 

Land



Wave



Ocean



Sea ice

## Coupled data assimilation (IFS/NEMO)



 $\rightarrow$  4D-VAR assimilation is an iterative algorithm

 $\rightarrow$  CDA produces implicit cross-correlations using the physics of the coupled model

 $\rightarrow$  Several outer iteration to ensure a consistent coupled analysis

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#### Ensemble data assimilation



*"An ensemble of perturbed first-guesses is transformed in an ensemble of analysis by running the assimilation system on each member"* 

### CERA-20C ensemble spread

#### 10-member of CERA-20C showing uncertainties in the climate reconstruction



### CERA-20C improved over ERA-20C

RMSE error in geopotential height for MAM 2010



CERA-20C has reduced by 20-30% the error in the troposphere compared to ERA-20C

## Issue with sea ice in CERA-20C

Arctic sea-ice thickness in March 1932



→ CERA-20C was the first application using the coupled model on an interannual time-scale

- $\rightarrow$  lack of summer melting, leading to the accumulation of Arctic sea ice over the years
- $\rightarrow$  sea-ice extent under control thanks to the SST relaxation

### 20CR reanalysis





Confidence has been improved in 20CRv3 at high latitude

(b) 20CRv3

 $\infty$ 

JFM for 1916-191



(c) 20CRv3 minus 20CRv2c



1- spread\_ens/spread\_clim

Slivinski et. al., Towards a more reliable historical reanalysis: Improvements for version3 of the Twentieth Century Reanalysis system

## The importance of data rescue (WeatherRescue.org)



Mean-sea-level pressure from 20CRv3 without (left) and with (right) additional observations from the UK Daily Weather Reports

Extra observations improves the representation of the storm and increase the confidence (clustering of the different members)

Ed Hawkins and Philip Brohan

Skill of seasonal hindcasts initialised by climate reanalyses

Re-forecast experiments over the period 1901-2010: ECMWF's atmospheric model with prescribed SSTs and sea-ice (uncoupled) Initial condition: ERA-20C ECMWF's fully coupled atmosphere-ocean-sea-ice model (coupled) Initial condition: CERA-20C

- IFS model cycle 41R1 (in-between S4 and SEAS5), T<sub>L</sub>255L91 (60km))
   + NEMO ORCA1L42 + LIM2
- Ensemble with 51 perturbed members
- Focus here: 4-month forecast initialised on  $1^{st}$  of Nov each year ( $\rightarrow$  DJF)

### Multi-decadal variability of NAO forecast skill (moving window)



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#### Conclusions

#### Reanalysis provides a consistent and comprehensive reconstruction of the climate



Multi-decadal variability of winter NAO forecast skill in coupled and uncoupled hindcasts over the 20th Century (1901-2010)

Achieving good forecast skill for recent decades is not sufficient to guarantee similar good performance in the future



#### **CERA-20C** climate dataset

#### SECMWF ≡

Public Datasets Select dataset 
Current activity

Contact Patrick Laloyaux-

Help-

#### CERA-20C, Synoptic Monthly Means

#### Select a year

#### Type of level

<ul> <li>Model levels</li> <li>Potential temperature</li> <li>Potential vorticity</li> </ul>	$\bigcirc$ 1901	$\bigcirc$ 1902	$\bigcirc$ 1903	$\bigcirc$ 1904	$\bigcirc$ 1905	$\bigcirc$ 1906	$\bigcirc$ 1907	$\bigcirc$ 1908	$\bigcirc$ 1909	$\bigcirc$ 1910	$\bigcirc$ 1911	$\bigcirc$ 1912	$\bigcirc$ 1913
	○1914	○1915	○1916	○1917	○1918	○1919	○1920	○1921	○1922	O 1923	O 1924	O 1925	○ 1926
	○ 1927	○1928	○1929	○1930	○1931	○1932	○1933	○1934	○1935	○1936	○1937	○1938	○ 1939
Pressure levels	○1940	$\bigcirc$ 1941	○1942	○1943	○1944	○1945	○1946	○1947	○1948	○1949	$\bigcirc$ 1950	○ 1951	○1952
• Surface	○ 1953	$\bigcirc$ 1954	$\bigcirc$ 1955	○1956	$\bigcirc$ 1957	$\bigcirc$ 1958	$\bigcirc$ 1959	○1960	○1961	○1962	O 1963	O 1964	○ 1965
	◯ 1966	O 1967	○1968	○1969	$\bigcirc$ 1970	$\bigcirc$ 1971	○1972	○1973	$\bigcirc$ 1974	O 1975	○1976	○ 1977	○1978
Туре	○ 1979	○1980	○1981	○1982	○1983	○1984	○1985	O 1986	○1987	○1988	○1989	○ 1990	O 1991
• Analysis	○ 1992	○1993	$\bigcirc$ 1994	$\bigcirc$ 1995	○1996	$\bigcirc$ 1997	○1998	$\bigcirc$ 1999	○2000	$\bigcirc$ 2001	○2002	○2003	○2004
• Forecast	○ 2005	○2006	○2007	○2008	○2009	○2010							

#### https://apps.ecmwf.int/datasets/data/cera20c





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#### **RESEARCH ARTICLE** CERA-20C: A Coupled Reanalysis of the Twentieth Century

10.1029/2018MS001273

#### **Key Points:**

- CERA-20C reconstructs the past climate of the atmosphere, ocean, land, waves, and sea ice
- CERA-20C provides a 10 member ensemble of reanalyses to account for errors
- CERA-20C shows significant improvements in the troposphere, compared to ERA-20C and 20CRv2c

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**Abstract** CERA-20C is a coupled reanalysis of the twentieth century which aims to reconstruct the past weather and climate of the Earth system including the atmosphere, ocean, land, ocean waves, and sea ice. This reanalysis is based on the CERA coupled atmosphere-ocean assimilation system developed at ECMWF.