#### Advances in land data assimilation at Météo-France

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#### Outline

- Main features of NWP models at Météo-France
- Short history and current status on land data assimilation at Météo-France
- Description of a new land data assimilation system within SURFEX
- Feasibility studies :
  - Assimilation of screen-level variables  $(T_{2m}, RH_{2m})$
  - Assimilation of satellite derived superficial soil moisture  $(w_s)$
  - Assimilation of satellite derived surface albedo and LAI
- List of perspectives and issues

#### Météo-France NWP models

- ARPEGE : Spectral global stretched model T538C2.4L60 (15 km resolution over France) - multi-incremental 6h 4D-Var assimilation system at (T107/T224) (90 km)
- ALADIN : Spectral limited area model E149x149C1L60 (9.5 km resolution) 6h 3D-Var assimilation system
- AROME : Spectral limited area model E255x299C1L41 (2.5 km resolution) 3h 3D-Var assimilation system
- Summary of physical parameterizations : TKE vertical diffusion scheme, *deep convection mass-flux scheme* (*Bougeault*), cloud microphysical scheme (4/5 hydrometeors), shallow convection mass-flux scheme (Kain-Fritsch), ECMWF RRTM radiation scheme, ISBA land surface scheme (externalized modelling platform SURFEX)

## Land data assimilation at Météo-France 25 years ago (1)

The force-restore equations (Deardorff, 1977; 1978) in the hemispheric model EMERAUDE :

$$\frac{\partial T_s}{\partial t} = C_T (R_n - H - LE) + \frac{2\pi}{\tau_1} (T_2 - T_s)$$

$$\frac{\partial T_2}{\partial t} = \frac{2\pi}{\tau_2} (T_s - T_2)$$

$$\frac{\partial w_s}{\partial t} = \frac{1}{\rho_w d_1} (P_g - E_g) - \frac{1}{\tau_1} (w_s - w_2)$$

$$\frac{\partial w_2}{\partial t} = \frac{1}{\tau_2} (w_s - w_2)$$

with  $\textit{w_{sat}} imes \textit{d}_1 = 10$  mm,  $\tau_1{=}1$  day and  $\tau_2{=}5$  days

## Land data assimilation at Météo-France 25 years ago (2)

Soil analysis equations based on increments from a screen-level analysis of temperature  $T_{2m}$  and relative humidity  $RH_{2m}$  using SYNOP data :

$$T_{s}^{a} = T_{s}^{b} + (T_{2m}^{a} - T_{2m}^{b})$$

$$T_{2}^{a} = T_{2}^{b} + \left[\frac{\tau_{1}}{\tau_{2}}(T_{2m}^{a} - T_{2m}^{b})\right]$$

$$w_{s}^{a} = w_{s}^{b} + w_{sat}(RH_{2m}^{a} - RH_{2m}^{b})$$

$$w_{2}^{a} = w_{2}^{b} + w_{sat}\left[\frac{\tau_{1}}{\tau_{2}}(RH_{2m}^{a} - RH_{2m}^{b})\right]$$

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adapted from Coiffier et al. (1987)

### Current land data assimilation at Météo-France (1)

Same methodology adapted to the ISBA-2L scheme with an emphasis on soil moisture  $(w_s, w_2)$  by using optimum interpolation (OI) coefficients (statistics of forecast errors derived from a set of Monte-Carlo experiments) [Mahfouf, 1991].

$$T_{s}^{a} = T_{s}^{b} + \mu_{1}(T_{2m}^{a} - T_{2m}^{b}) + \mu_{2}(RH_{2m}^{a} - RH_{2m}^{b})$$

$$T_{2}^{a} = T_{2}^{b} + \nu_{1}(T_{2m}^{a} - T_{2m}^{b}) + \nu_{2}(RH_{2m}^{a} - RH_{2m}^{b})$$

$$w_{s}^{a} = w_{s}^{b} + \alpha_{1}(T_{2m}^{a} - T_{2m}^{b}) + \alpha_{2}(RH_{2m}^{a} - RH_{2m}^{b})$$

$$w_{2}^{a} = w_{2}^{b} + \beta_{1}(T_{2m}^{a} - T_{2m}^{b}) + \beta_{2}(RH_{2m}^{a} - RH_{2m}^{b})$$

Analytical formulation of the  $\alpha_i$  and  $\beta_i$  coefficients (dependencies with solar time, soil texture and vegetation properties) [Bouttier et al. (1993); revised by Giard and Bazile (2000)]. For temperature :  $\mu_1 = 1$ ,  $\mu_2 = 0$ ,  $\nu_1 = 1/2\pi$ ,  $\nu_2 = 0$ 

# Current land data assimilation at Météo-France (2)

Operational configuration :

- Soil analysis for ARPEGE (with climatological relaxation) (since 1998) and ALADIN (no climatological relaxation) (since 2009).
- AROME soil initial state = interpolation of ALADIN analysis

Also used operationally at Météo-France, ALADIN and HIRLAM partners, CMC, ECMWF, (DWD, UKMO)

- OI scheme lacks flexibility for new observation types and new surface prognostic variables :
  - Satellite observations informative about superficial soil moisture (AMSR-E, ERS, ASCAT, SMOS, SMAP)
  - Precipitation analyses (raingauges, radars) and satellite derived downward radiative fluxes (EUMETSAT LandSAF)
  - Multi-layer versions of the ISBA scheme or versions describing photosynthesis (biomass = prognostic variable)

# Development of an offline land data assimilation system

- The surface models (ISBAs/Towns/Lakes/Oceans) have been externalized from the atmospheric models into a platform called SURFEX (SURFace EXternalized)
- SURFEX can be coupled to any atmospheric model used at Météo-France (ARPEGE, ALADIN, AROME, Méso-NH) [internal coupling using the strategy of Best et al. (2004)]
- SURFEX can be used in offline mode (e.g. validation studies against field experiments)
- New surface analysis schemes are being developed within SURFEX (offline version / semi-coupled) :
  - Optimum Interpolation
  - Extended Kalman Filter
  - Ensemble Kalman Filters and Particle Filters (collaborations with NILU/HIRLAM)

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### Coupling between the atmospheric model and the externalised soil assimilation



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# Comparaison of the OI and EKF soil analysis schemes in ALADIN

OI : Analytical coefficients used operationnally at Météo-France : Formulation of Giard and Bazile (2000) but  $\beta_1$  and  $\beta_2$  reduced by a factor of 6 (F. Bouyssel, personnal communication)

EKF : Dynamical coefficients :

$$\mathbf{K} = \mathbf{B}\mathbf{H}^T(\mathbf{H}\mathbf{B}\mathbf{H}^T + \mathbf{R})^{-1}$$

where the matrices  ${\bf B}$  and  ${\bf R}$  are prescribed and the Jacobian of the observation operator  ${\bf H}$  obtained in finite differences :

$$\mathbf{H} \approx \frac{\mathbf{y}^t (w_2^0 + \Delta w_2^0) - \mathbf{y}^t (w_2^0)}{\Delta w_2^0}$$

Affordable because the ISBA scheme is run in offline mode and soil columns are treated independently.

### OI vs EKF coefficients : $\beta_1$ and $\beta_2$ (01/07/2006 at 12 UTC)



-15 -10 -5 -2 -1 -0.2 0.2

15°W

15°W



-20 -10 -2 2 10 20 50 100 150



01

EKF

#### Analysis increments of $T_{2m}$ and $RH_{2m}$ (mean over July 2006)



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# Deep soil moisture increments in July 2006 (mm)

EKF increments - OI increments



With ISBA-2L,  $\sigma_{w_2}^b \simeq 0.01 m^3/m^3$  leads to  $\Delta w_2 \simeq 50 mm$ 

### Preliminary studies on the assimilation of *w<sub>s</sub>* satellite products

- Products currently evaluated : AMSR-E/Aqua, SCAT/ERS, ASCAT/MetOp
- These products have been easily introduced in the EKF
- Examination of the model Jacobians (i.e. link between  $w_s$  and  $w_2$ ) : rather linear (too) large in ISBA 2-L simple enough for an analytical formulation
- Importance of a bias correction scheme
- The specification of the covariance matrix of background errors **B** is an issue with ISBA-2L for combined assimilation of conventional and satellite observations.

$$\sigma^b_{w_2} \simeq 0.01 m^3/m^3 << \sigma^o_{w_s} \simeq 0.06 m^3/m^3$$

Preliminary studies on the assimilation of satellite derived surface albedo and LAI

- Simple analysis schemes : slow evolution of the associated dynamics compared to availability of satellite observations (forward operator close to identity).
- Feasibility studies with a Kalman Filter for MSG surface albedo : Optimal combination between observations (climatological albedo and MSG daily surface albedo) and a priori bare soil and vegetation albedos. Positive impacts on forecast scores for  $T_{2m}$  in ALADIN.
- Use of ISBA-A-gs (describing photosynthesis and plant growth) for the assimilation of *LAI* in the EKF (local scale : SMOSREX ; France : FP7 GEOLAND 2 projet)

### Current activities and remaining issues (1)

- Development of a soil analysis for AROME based on OI (initialisation of "town" temperatures)
- Analysis of snow depth from SYNOP observations (OI CANARI) [inclusion of snow extent information from MSG]
- Use of radar precipitation in the EKF for correcting soil moisture contents
- Assimilation of ASCAT soil moisture in the ALADIN 3D-Var (and then in ARPEGE 4D-Var)
- Improvement of background/model error statistics for soil variables (ensemble forecasts or assimilations)

## Current activities and remaining issues (2)

- Assimilation of ASCAT soil moisture in the hydrometeorological system SIM (over France)
- Improvement of the screen-level analysis (FP7 EURO4M project)
- Intercomparison between EKF and EnKF (eventually PFs)
- GEOLAND 2 : combined assimilation of LAI and SWI
- Preparation of SMOS : coupling of SURFEX with microwave RTM (CMEM) scaling issues

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# Important items for the assimilation of satellite $w_s$ ?

- Improved land data assimilation system : not sure ! no strong non-linearities
- Improved land surface scheme : yes (root zone depth, soil textural properties, surface energy balance)
- Improved specification of errors : yes (diagnostics first)
- Improved bias correction schemes : yes (which one is right ?)

 Importance of other products over limited area domains : geostationnary satellites (albedo, radiative fluxes), radars, raingauges, screen-level variables - examine combined assimilations

# Thank you for your attention !