

# ***Soil Moisture Data Assimilation in the Canadian Land Data Assimilation System (CaLDAS)***

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Environment Canada*

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Dorval, QC, Canada***



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# ***Objectives / Requirements for the new Land -Surface Modeling and Data Assimilation System***

- ***Improve environmental predictions from Environment Canada's operational systems including :***
  - *deterministic NWP systems (regional, global, LAM), ensemble prediction systems (regional, global), seasonal, climate, hydrology ...*
- ***Provide accurate analysis of the current state of the land surface, including the following variables :***
  - *soil moisture, snow conditions (coverage, water equivalent, density), temperatures, albedo, emissivity, vegetation characteristics (leaf area index and fractional coverage)*
- ***Provide operational products that could be useful to other government departments, like for example :***
  - *Agriculture and Agri-Food Canada (AAFC), Natural Resources Canada (NRCan).*

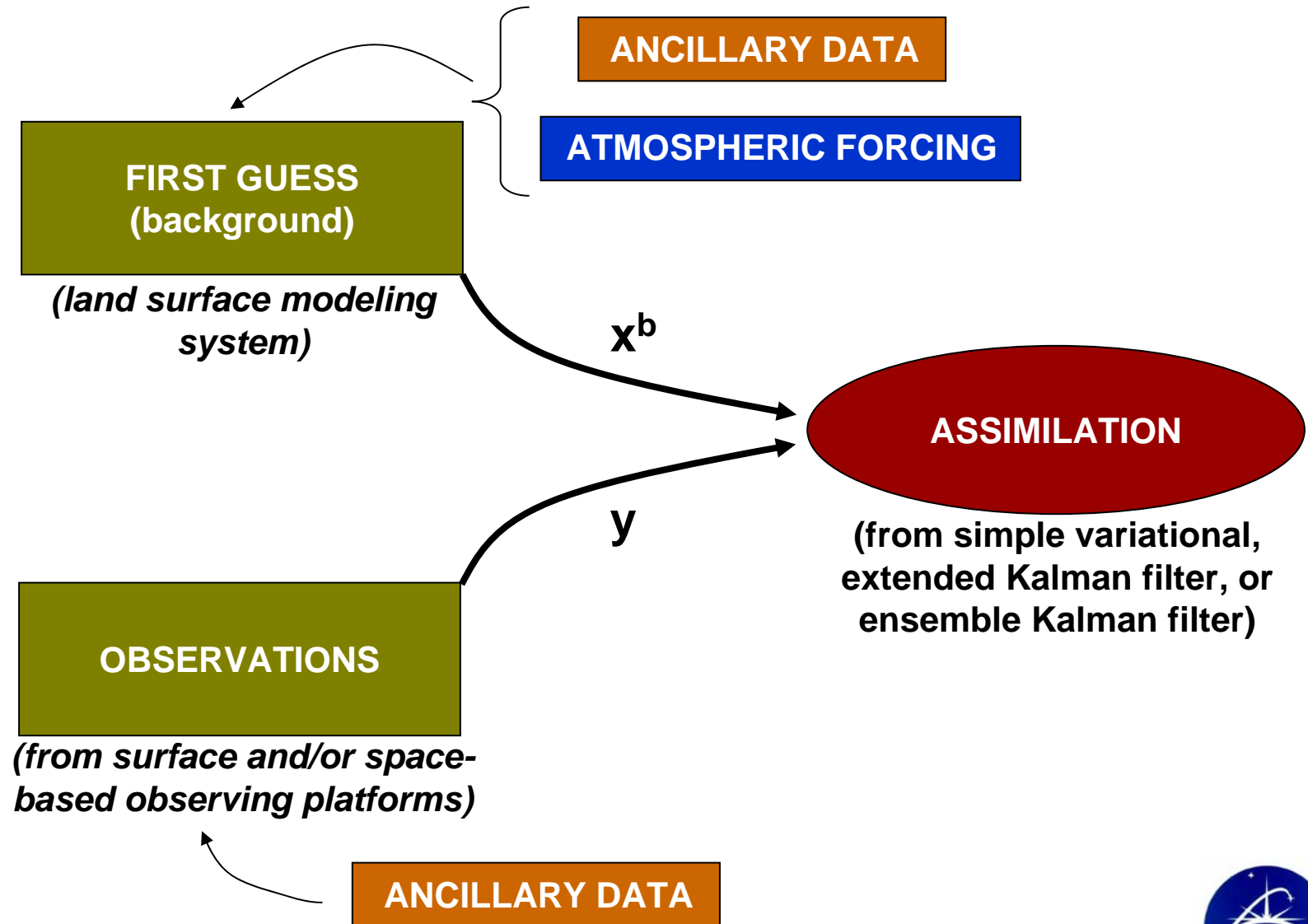


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# Canadian Land Data Assimilation System (CaLDAS)



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# Data Assimilation



## Analysis equation

$$\mathbf{x}^a = \mathbf{x}^b + \underbrace{\mathbf{B}\mathbf{H}^T}_{\text{Gain Matrix}} \underbrace{\left[\mathbf{H}\mathbf{B}\mathbf{H}^T + \mathbf{R}\right]^{-1}}_{\text{Innovation Vector}} \left[\mathbf{y} - \mathbf{H}(\mathbf{x}^b)\right]$$

Keys to the success of data assimilation methods rests largely upon the accurate specification of the input error parameters.

## Modeling of First-Guess Uncertainty : B Matrix

### Initial conditions

*Soil moisture*

*Surface temperature*

*Snow conditions*

### Land surface characteristics (ancillary data)

**Vegetation characteristics (fraction coverage, LAI)**

**Soil texture**

**Albedo**

**Emissivity**

**orography**

### Atmospheric forcing

*U, V, T, q, SW↓, LW↓, **precipitation***

### Land surface modeling



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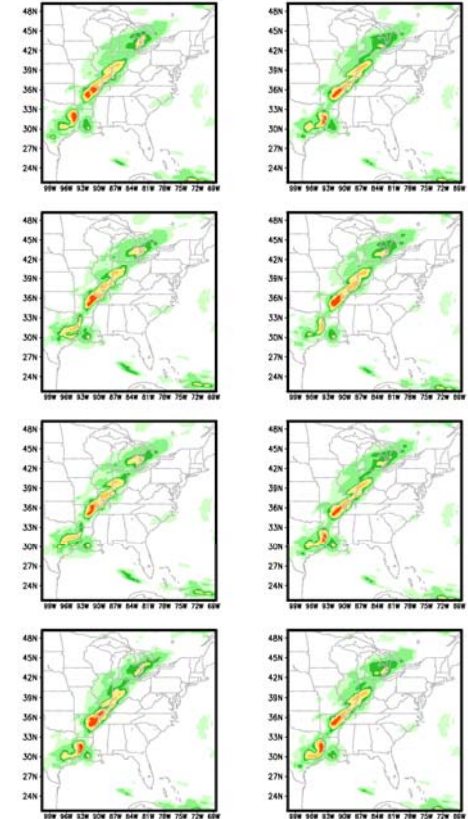
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# UNCERTAINTY ASSOCIATED with ATMOSPHERIC FORCING – INCLUDING PRECIPITATION



*Ensemble of  
precipitation  
analyses*



**Perturbed  
Precipitation Gauge  
Observations**

**Optimum Interpolation  
Assimilation**

**REPS or perturbed  
outputs from GEM-15**

*First-guess*

*Ensemble of  
forcing for :*

**Radiation  
Air temperature  
humidity  
Surface Pressure**

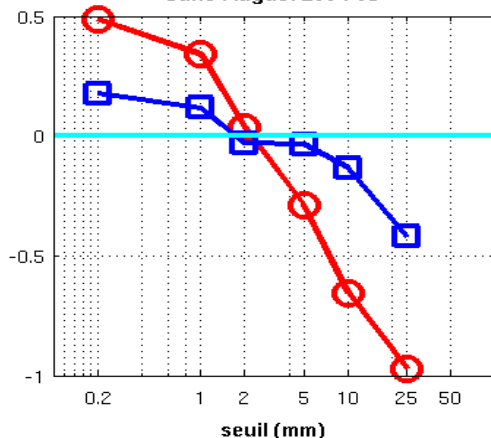
**DOWNSCALING  
(TERRAIN ADJUSTING)**

**EXTERNAL LAND  
SURFACE MODEL  
(ensemble modeling)**

# GEM-15 vs NARR (North American Regional Reanalysis) (6-h Precipitation) Comparison with ~ 100 Manned Stations

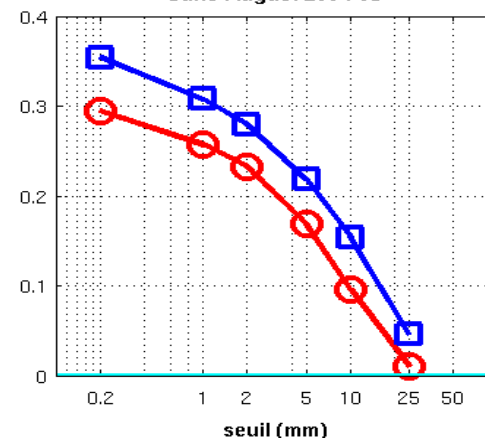
## Bias

FBI-1 (PR $\geq$ seuil)  
June-August 2004-09



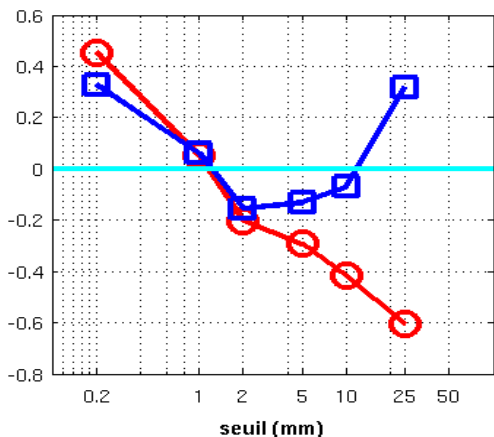
## Equitable Threat Score

ETS (PR $\geq$ seuil)  
June-August 2004-09

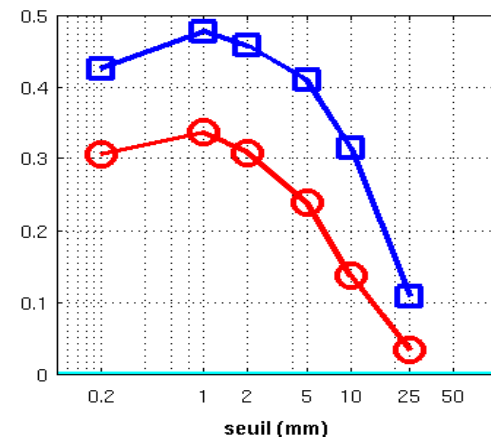


June - August  
2004 -2009

FBI-1 (PR $\geq$ seuil)  
Dec-Feb 2004-09



ETS (PR $\geq$ seuil)  
Dec-Feb 2004-09



Dec - Feb  
2004-2009



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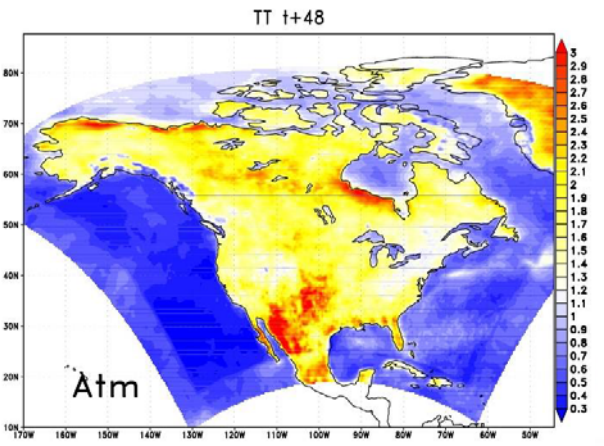
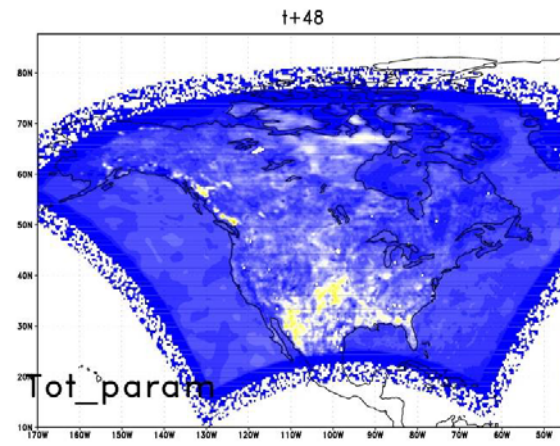
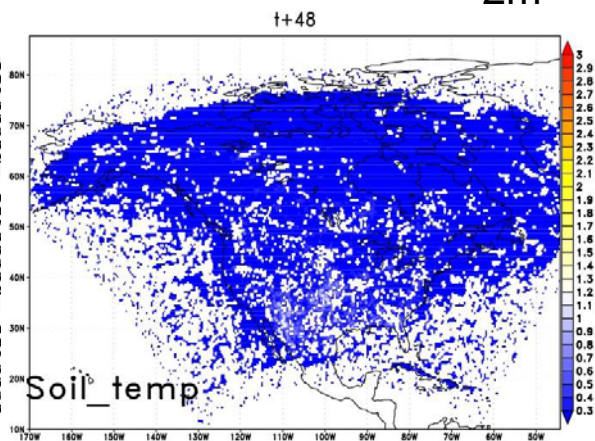
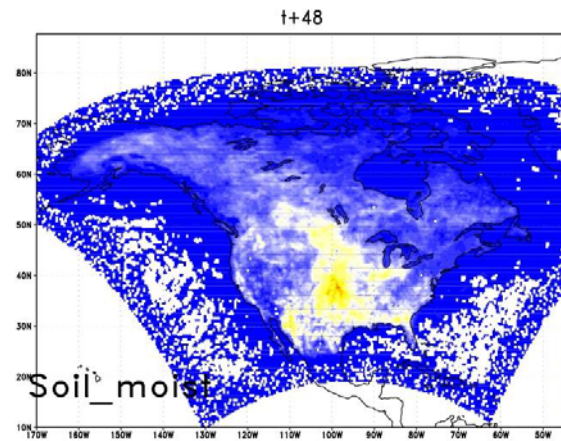
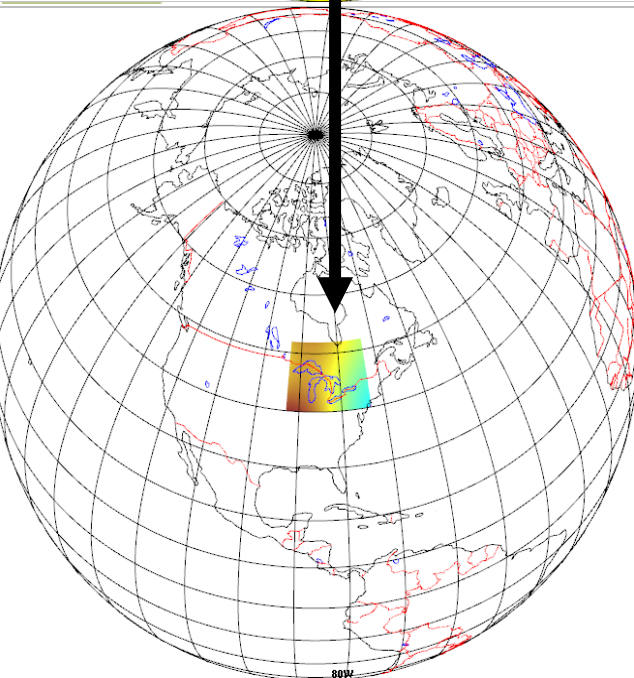
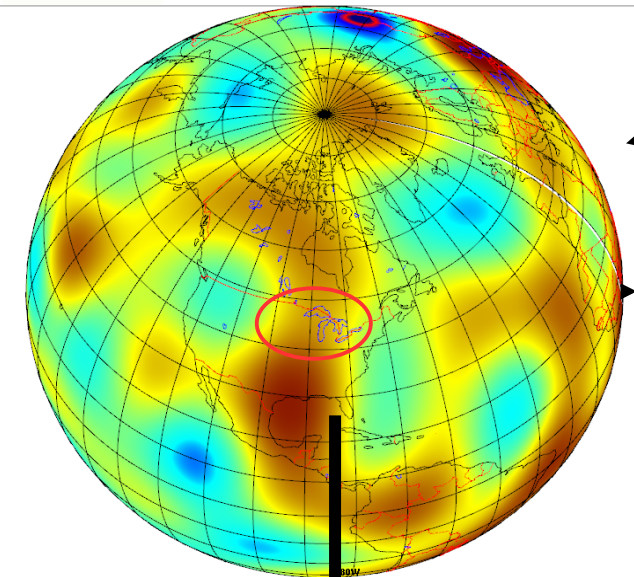
# UNCERTAINTY ASSOCIATED with LAND SURFACE CHARACTERISTICS



*First-order Markov Processes*

## **APPLICATION in REGIONAL ENSEMBLE PREDICTION SYSTEM**

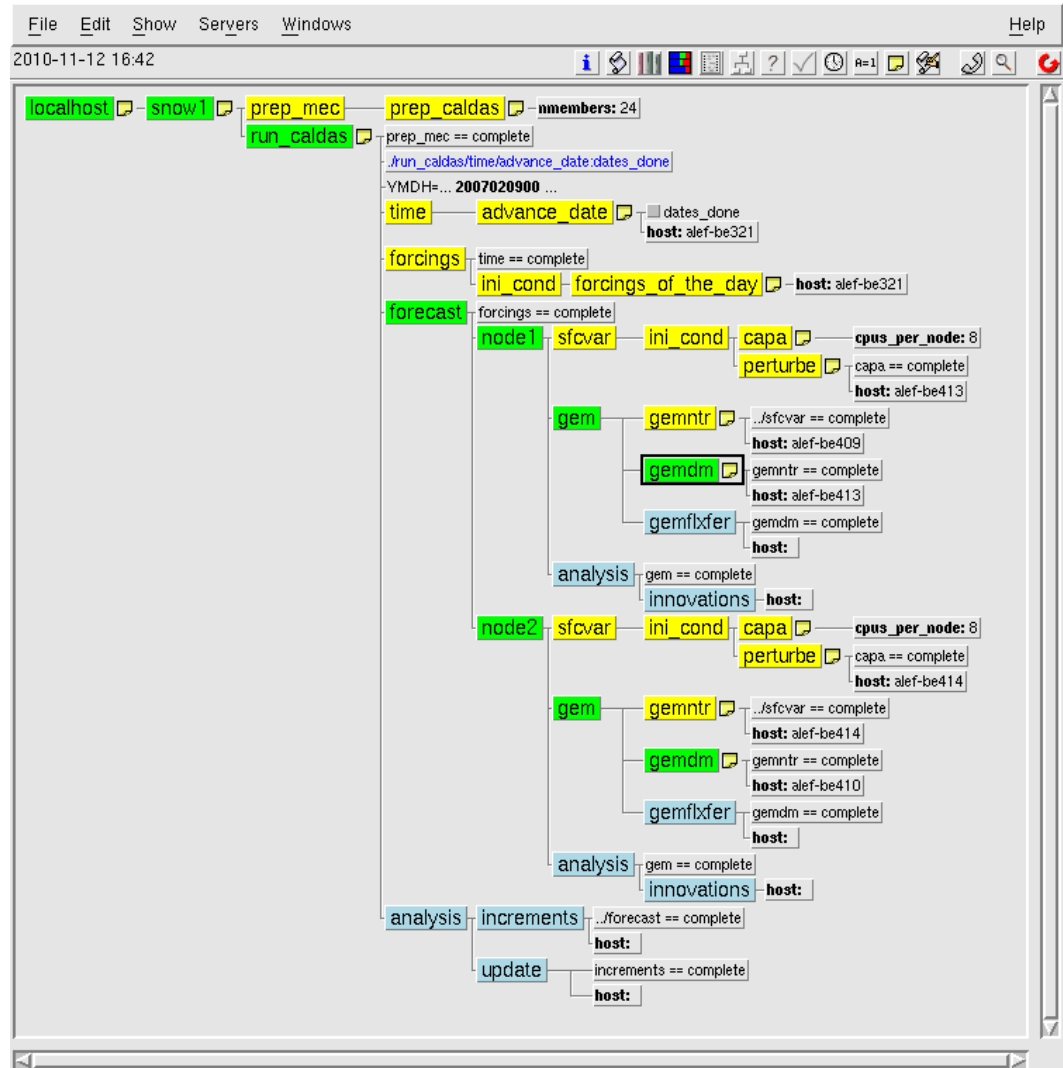
STD (K) for 48h (ensemble) predictions of  $T_{2m}$



# CaLDAS : Status

*A first version of CaLDAS has been coded and developed. Both an Ensemble Kalman Filter (EnKF) version and a simplified 2D-Var version are available. Both of these versions have been tested within the context of synthetic experiments.*

**CaLDAS within the  
Supervisor Monitor  
Scheduler (SMS) Task  
Sequencer**



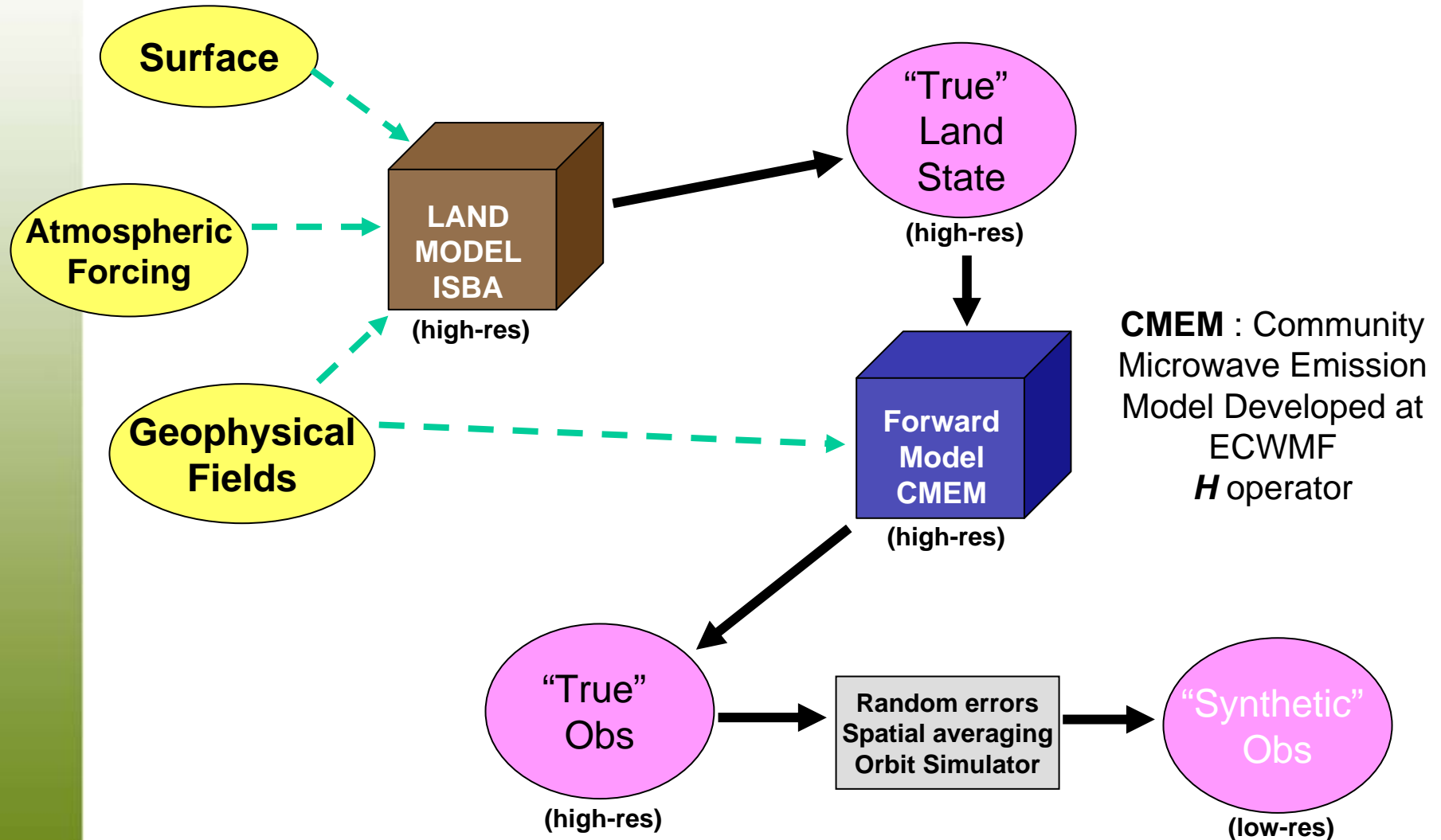
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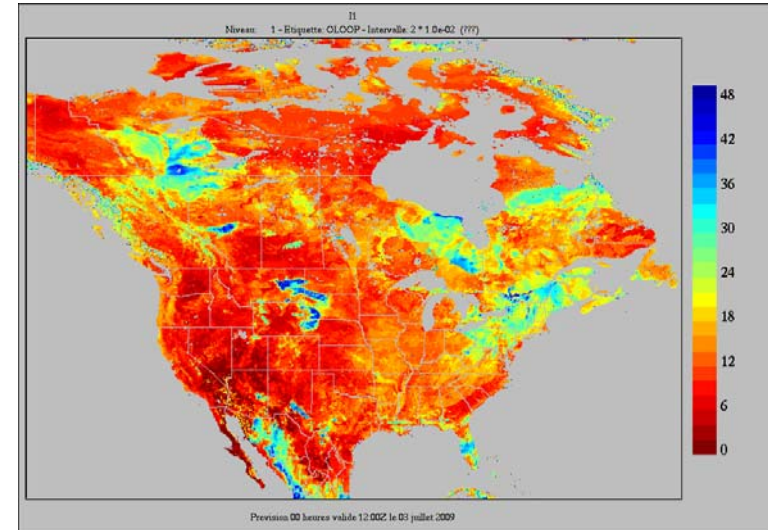
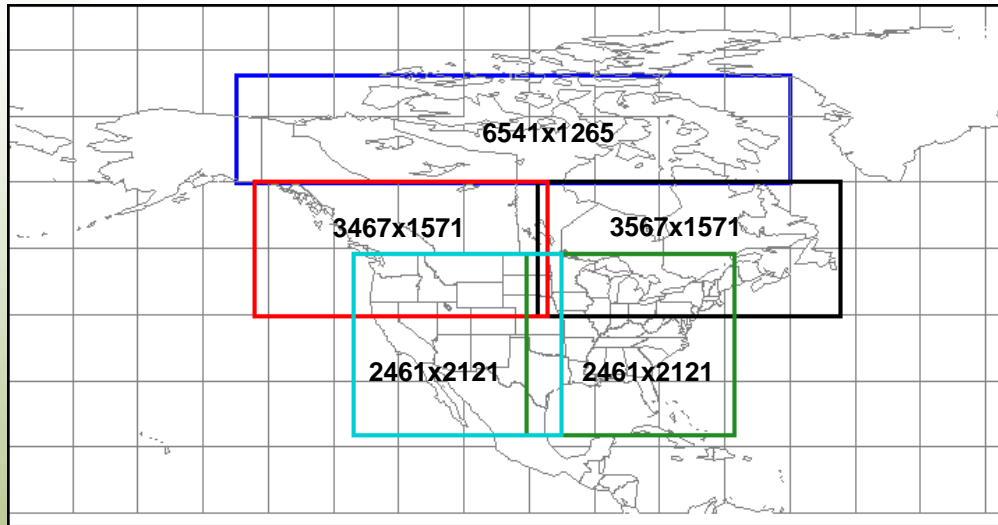


# Synthetic Experiment Design (I)

## Generation of Synthetic “Truth” Observations



# High-Resolution : Nature Run “Truth Run”



- *1-km resolution integrations of the ISBA land-surface model;*
- *Atmospheric forcing provided by short-range forecasts from the GEM-15 model;*
- *Geophysical fields generated from high-resolution land-surface databases;*
- *Time period : 30 March 2009 – 31 March 2010.*
- *North America : 5 separate integration grids*

**1200 UTC 3 July 2009**  
**Superficial Soil Moisture**  
**[10-cm depth]**



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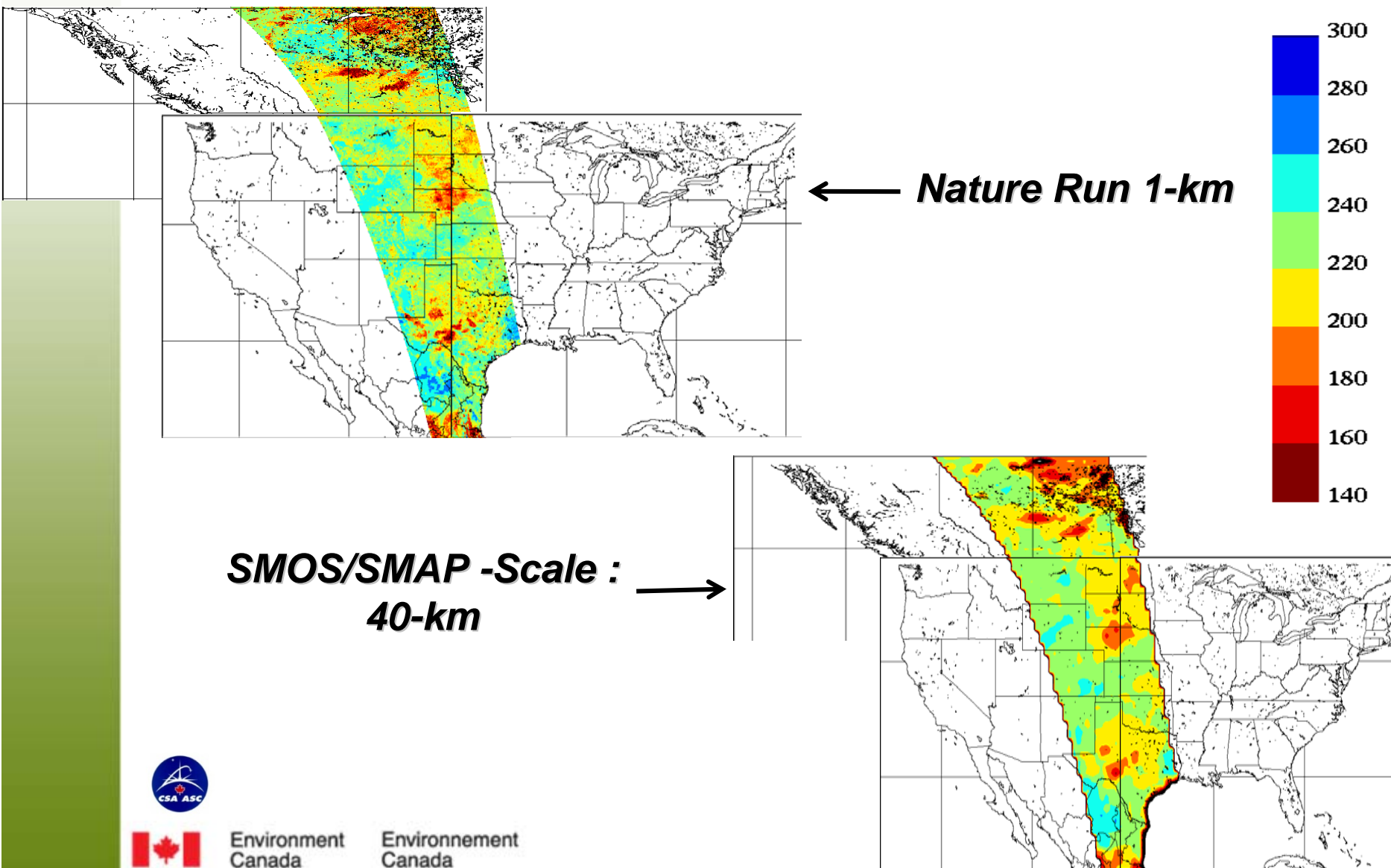


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# Brightness Temperatures (K) : Horizontal Polarization (40°)

1200 UTC 2 July 2009

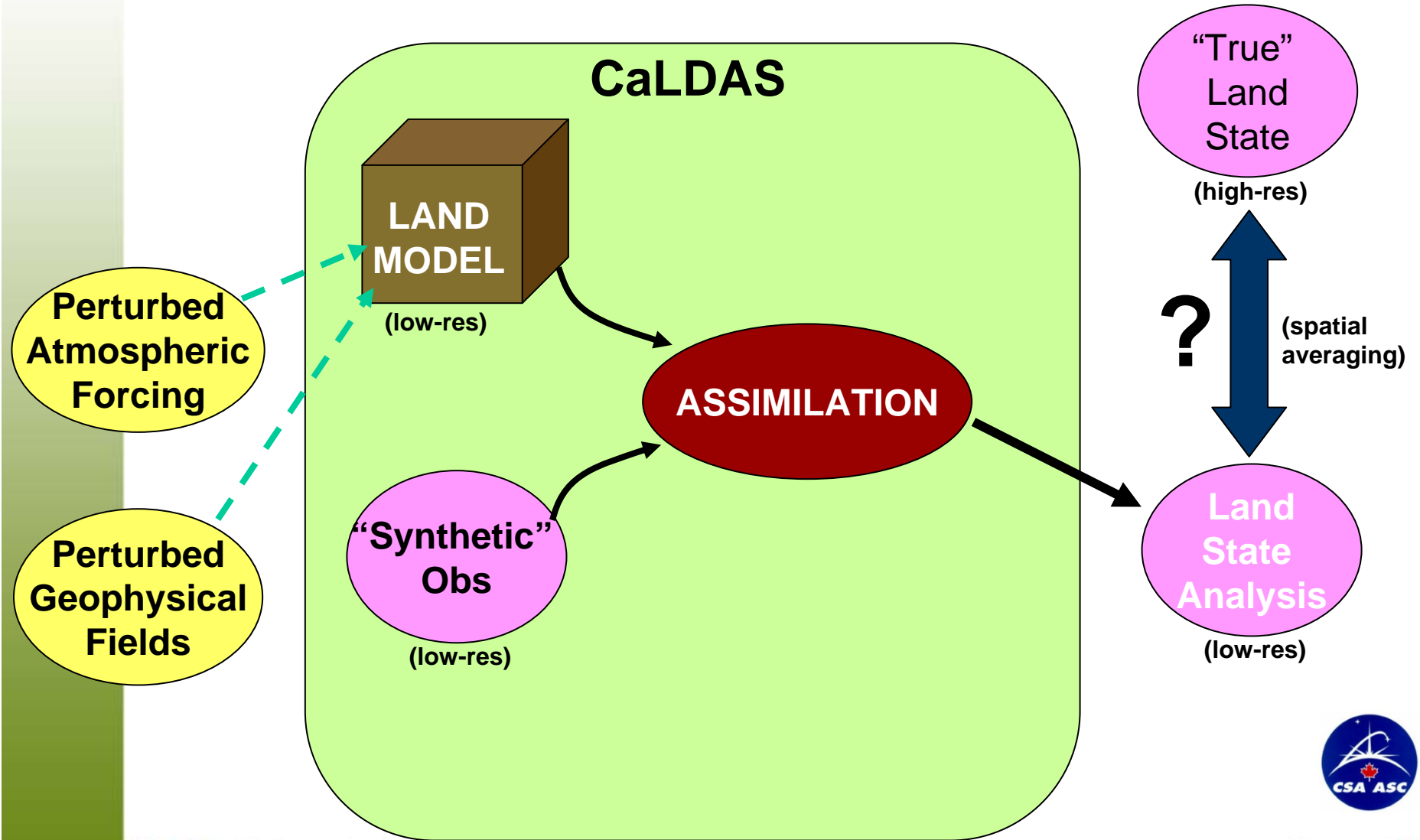


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# Synthetic Experiment Design (II)

## EnKF Data Assimilation Run



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# ***Synthetic Experiment-Specifications***

- **Assimilation grid** : 40-km resolution covering the eastern portion of North America.
- **Control variable** : Superficial soil moisture (10-cm depth).
- **Observations assimilated** : HH, VV polarization L-brightness temperatures at 40° incidence angle, spatially and temporally located using a SMOS-orbit simulator. Roughly a 2-3 day repeat cycle.
- **EnKF assimilation** run with 48 members.
- Each ensemble members is integrated with perturbed precipitation, radiation, air temperature derived from 30-42 hr GEM-15 forecasts.
- Surface albedo, vegetation fraction and leaf area index values were also perturbed as described.
- **Open loop integration** consists of one integration of the land-surface model .



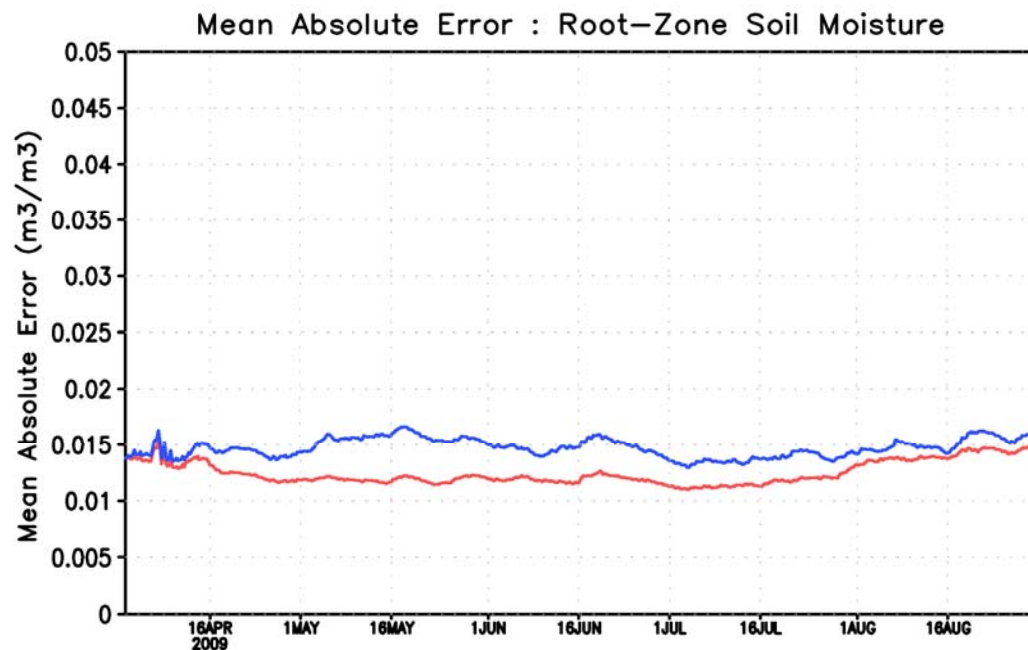
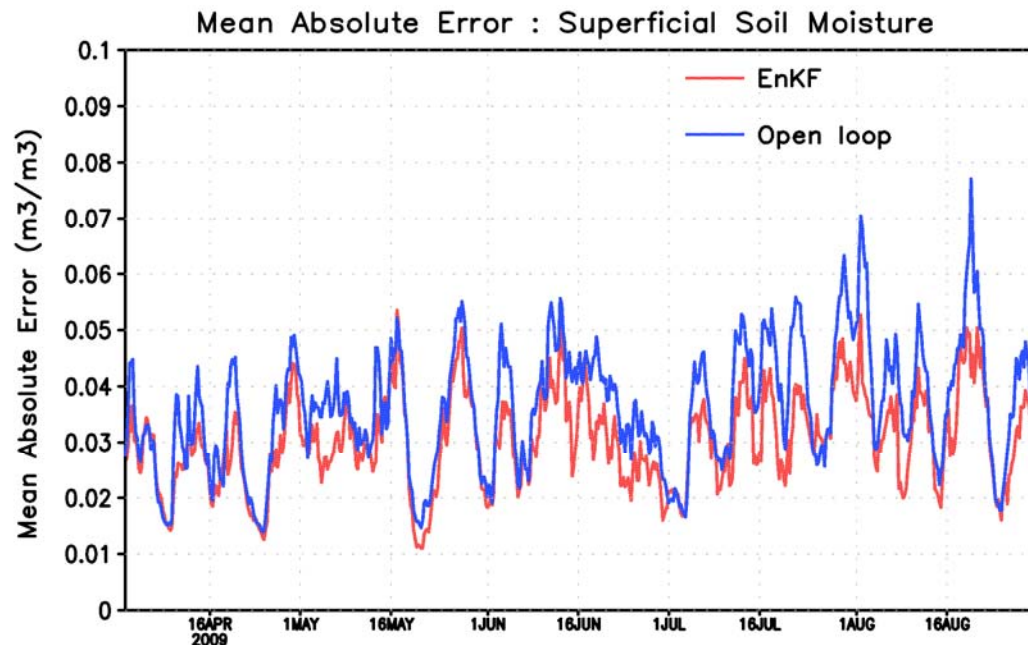
***Time series of domain-averaged soil moisture errors, considering only land points with very small water fractional coverage.)***

***Root-zone soil moisture is improved by roughly 0.002-0.003 m<sup>3</sup> m<sup>-3</sup>.***



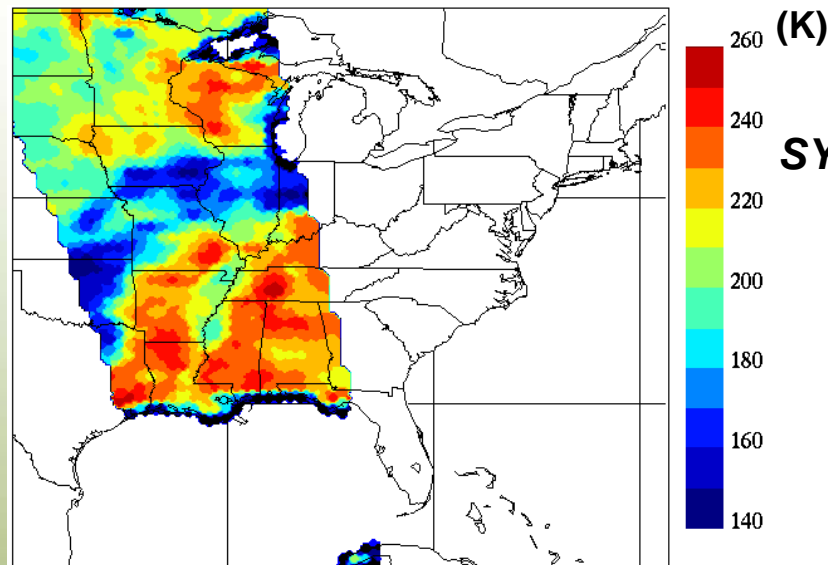
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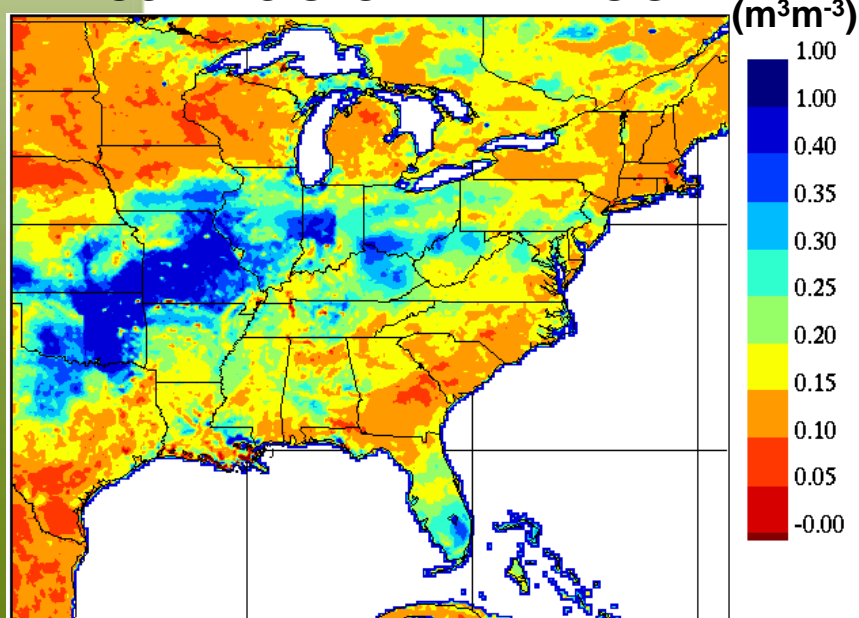


# SOIL MOISTURE ANALYSIS from SYNTHETIC EXPERIMENTS with CaLDAS

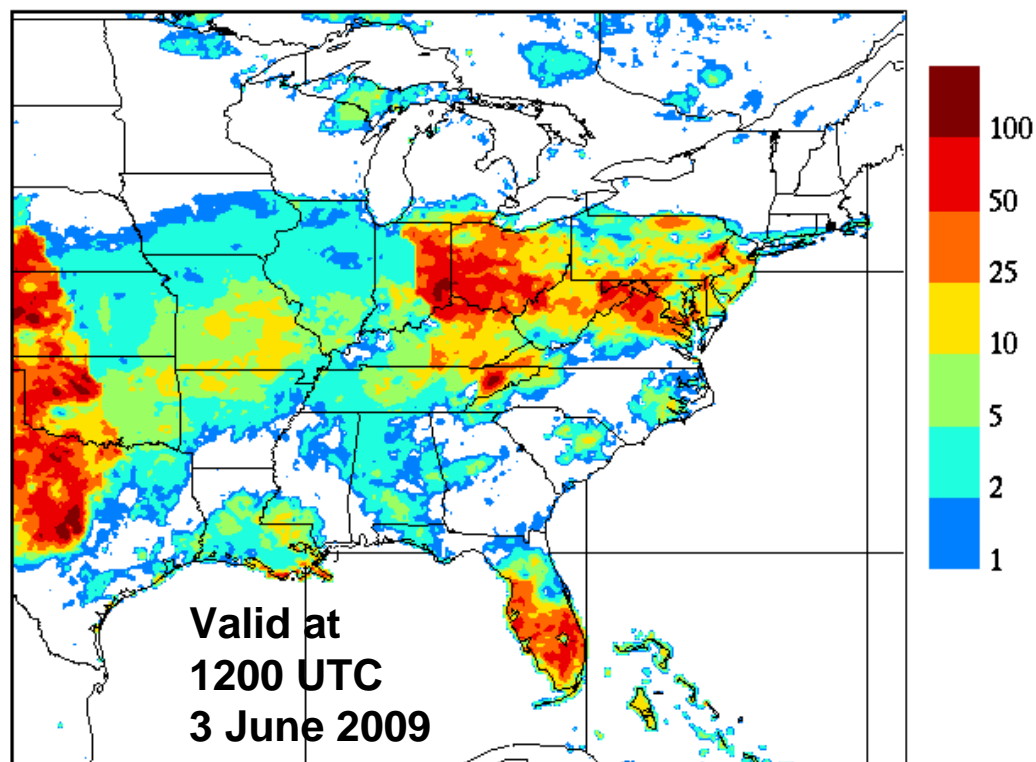


*SYNTHETIC Tb L-band (H-pol) at 40° (K)*

## SOIL MOISTURE ANALYSIS



## SOIL MOISTURE ERROR DIAGNOSTIC



# ***Research Themes and Applications***

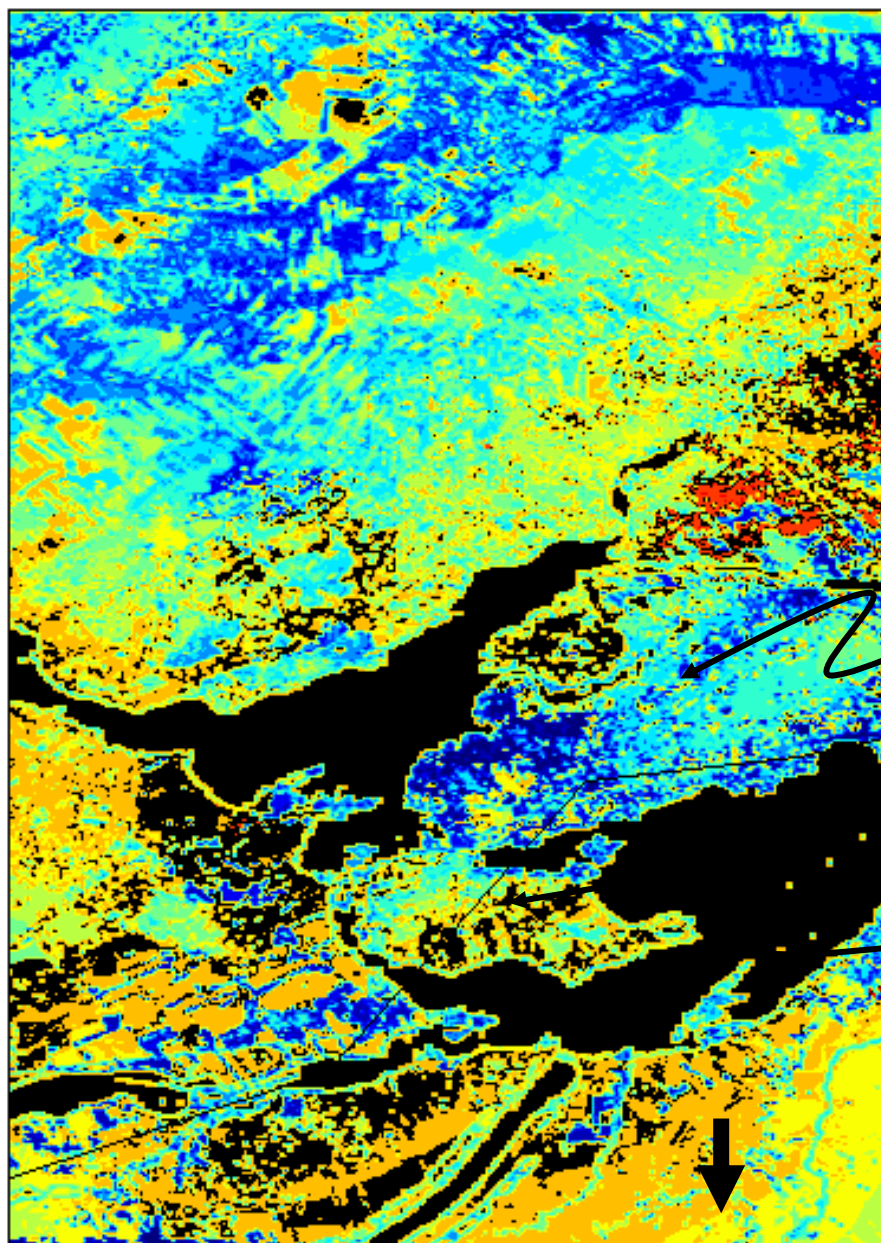
- **Different sources of information and observations related to soil moisture at varying temporal scales and spatial resolutions.**
  - SMOS/SMAP lower-resolution radiometer data (~ 40 km);
  - Screen-level observations of temperature and humidity at higher temporal frequency ;
  - Radarsat-2 C-band SAR data ;
  - Higher-resolution active radar measurements from SMAP;
- **Challenge is to develop methods and algorithms to optimally combine these different types of information.**
- **Incremental CaLDAS : Development of an incremental version of CaLDAS. Combination of a high-resolution land-surface model first-guess with the application of lower resolution analysis increments.**
- **Joint assimilation of passive and active L-band soil moisture measurements.**



# HIGH-RESOLUTION MODELING of SOIL MOISTURE (120m)

(Valid on  
1 August 2008)

Ontario ←



**Soil Water Index**



Montreal  
Island

Ile  
Perrot

USA



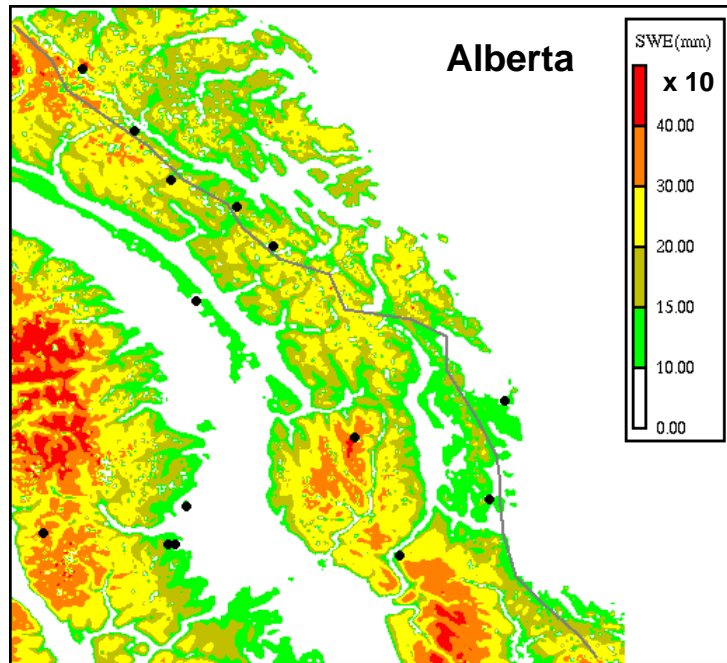
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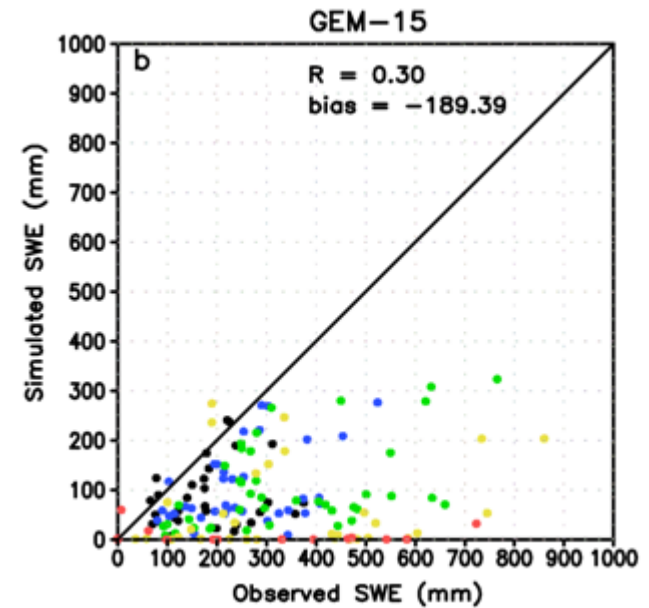
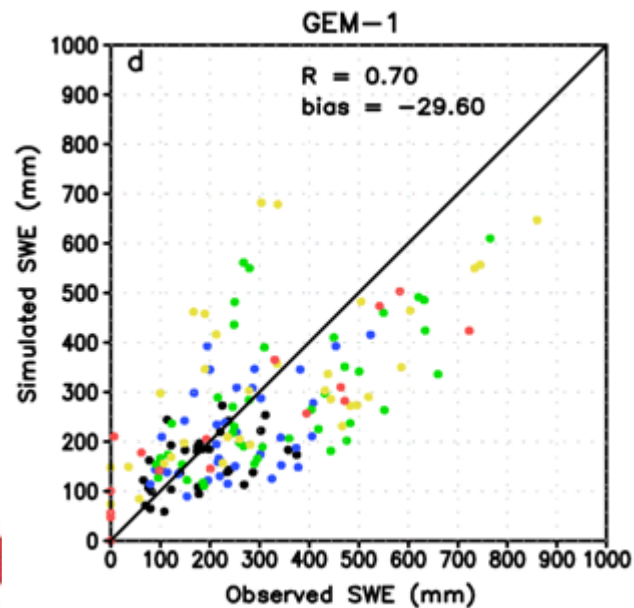
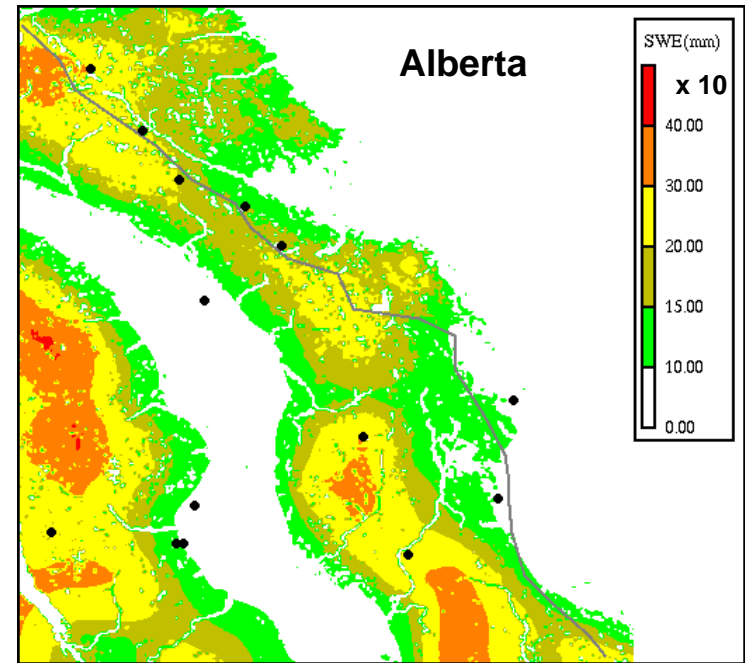
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# HIGH-RESOLUTION MODELING of TERRESTRIAL SNOW (1km)

## Mean Snow Water Equivalent



Winter  
2005/2006

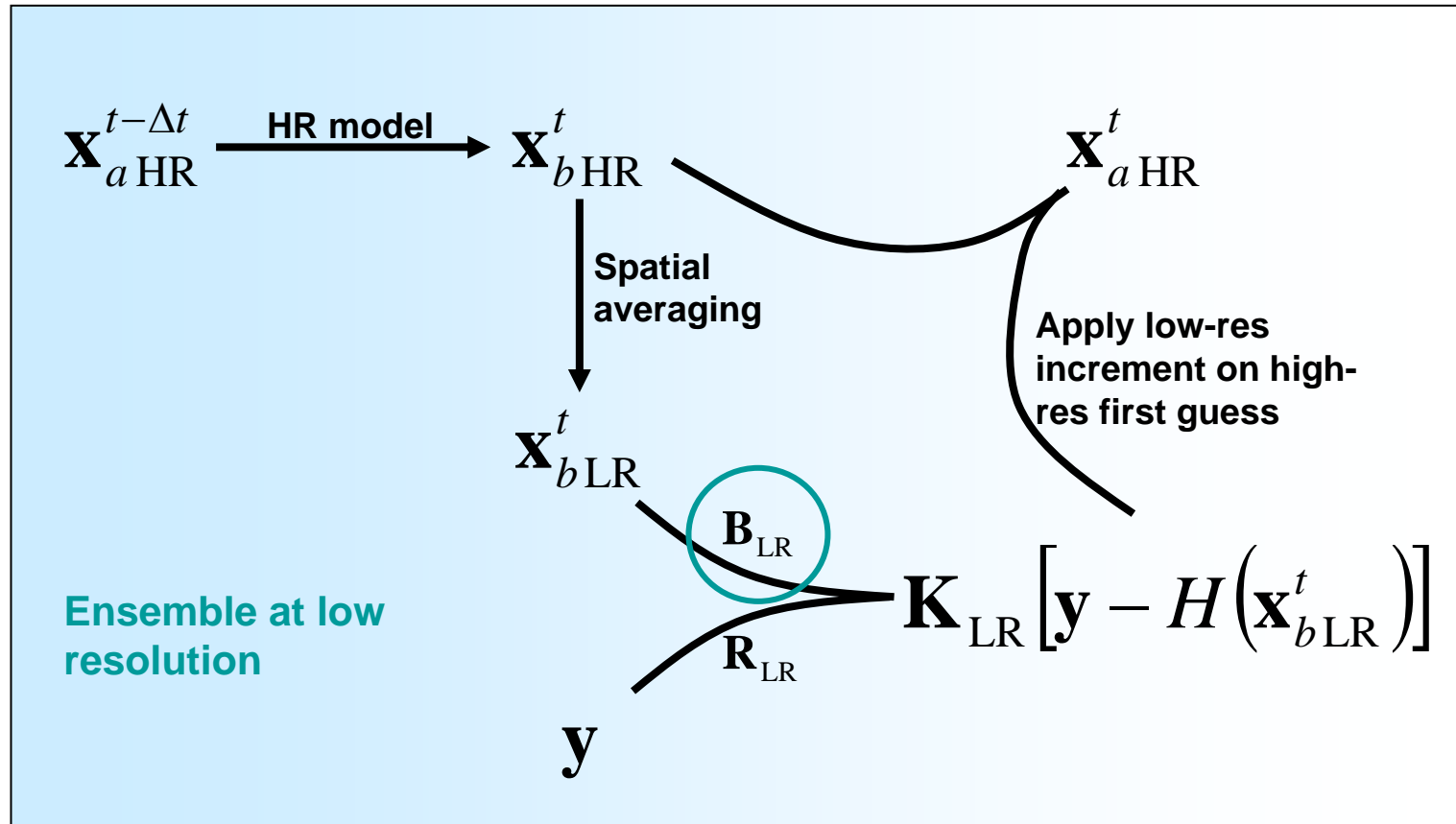




# INCREMENTAL VERSION of CaLDAS

HIGH-  
RESOLUTION  
(100m-2km)

LOW-  
RESOLUTION  
(10km-40km)



PREVIOUS  
ANALYSIS

BACKGROUND  
and  
OBSERVATIONS

NEW  
ANALYSIS



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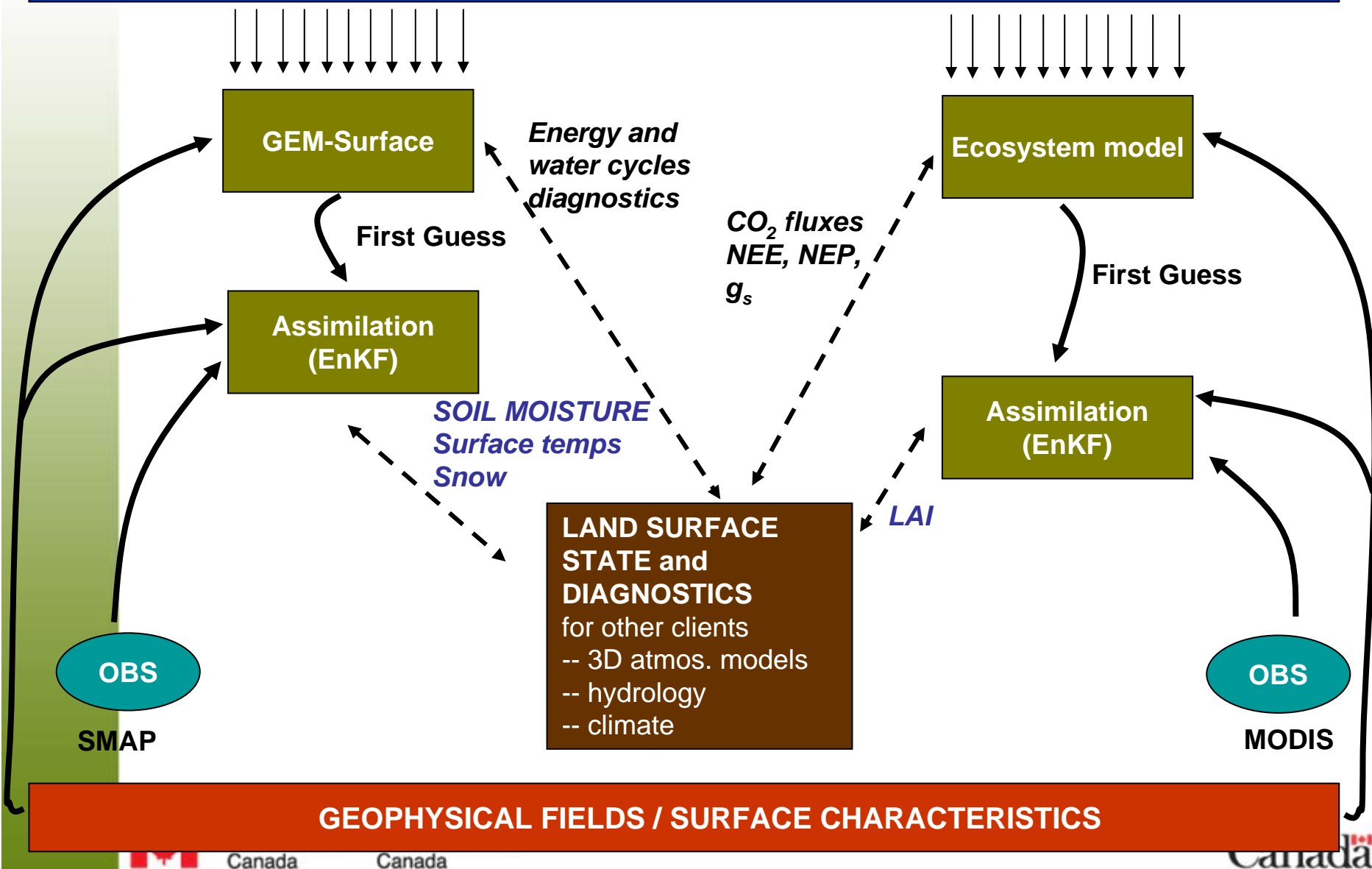
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# Future Land-Surface Modeling and Data Assimilation System

NWP Anal / SR forecasts

ATMOSPHERIC FORCING

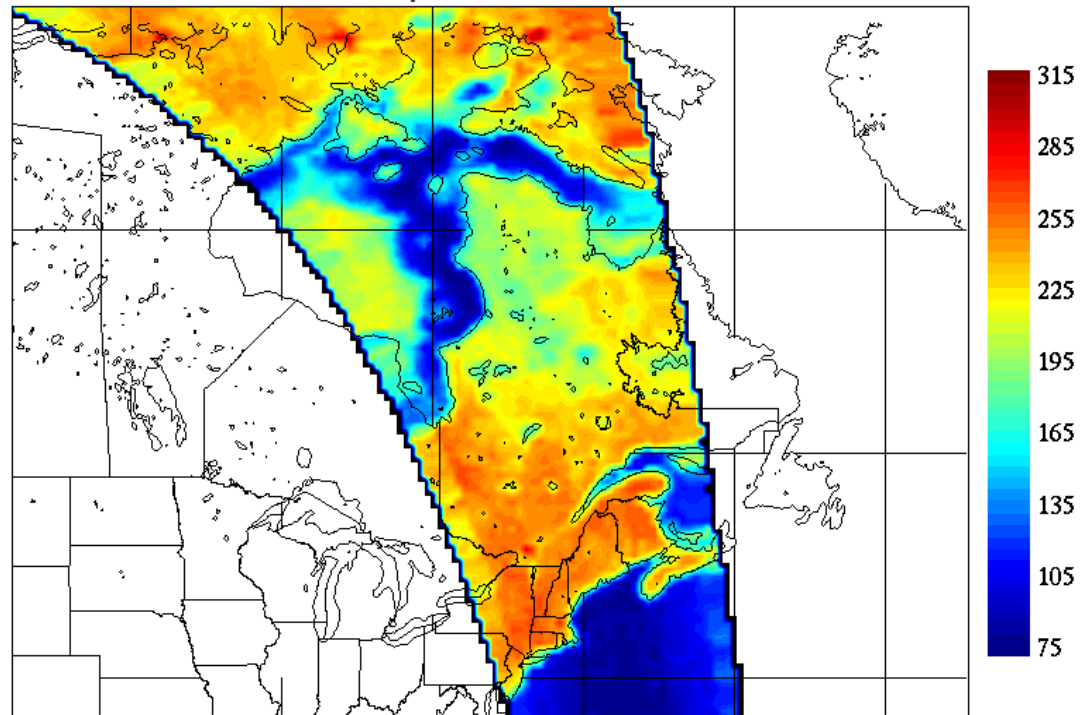
NWP Anal / SR forecasts





# ***SMOS TB 40° H-pol 1015 UTC 11 June 2010***

Environment Canada has been receiving the SMOS near real-time BUFR data since March 2010. These data will be assimilated within CaLDAS.



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