





### Outline

Page 2

#### Radiometric measurements

- Strongly contaminated by land: the same way as the other radiometers (SSM/I, TMI, AMSU...)
- Land emissivity nearly twice sea emissivity + more variable in space and time
- For a surface temperature of 300K, a 10% land contamination in the sea pixel will increase the TB by more than 10K → several centimeters!
- Classical retrieval algorithms developed assuming sea surface emissivity modeling are no more valid
- BUT only radiometer products can provide the required resolution to detect short scales SSH signals in coastal areas
- Alone or combined with other products (Mercier 2007, J. Fernandes 2011)



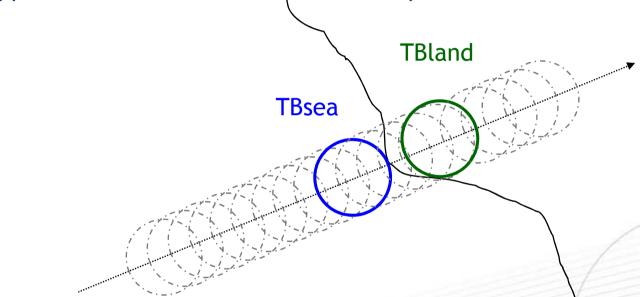




# Existing methods

 Correction of land contamination before application of the L2 ocean retrieval algorithm: Desportes et al, 2006

Applied on Jason2/AMR for the Pistach products



Desportes, 2008

 $TB\_corr(f)=TB(f)-corr(p,f)$   $corr(p,f)=[TBland(f)-TBsea(f)]\times p(f)$ 

f: frequency of the 3 channels (18.7, 23.8 and 34 GHz for Jason 1-2)

p(f): proportion of land in the footprint taking into account the antenna patterns

TBland: closest TB with 100% of land

TBsea: closest TB with 100% of sea





# **Existing methods**

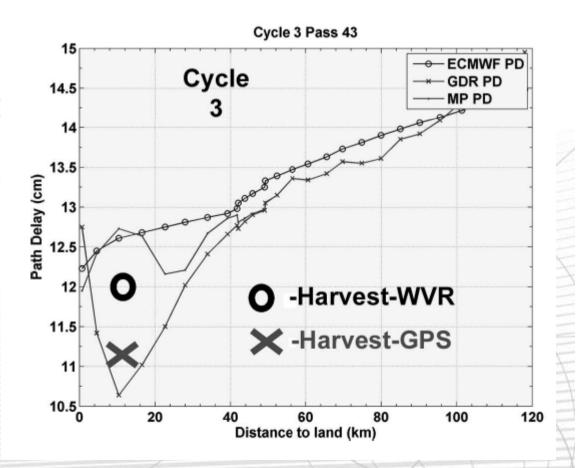
Page 4

- Land proportion used as external parameter in the L2 retrieval algorithm: Brown 2010 et al
- Applied in Jason2/AMR operational products

$$PD_{MP} = c_0 \left( PD_0, L_F^{18.7} \right) + \sum_f c_f \left( PD_0, L_F^{18.7} \right) \log \left( 280 - T_B(f) \right)$$

$$T_{\text{MB}}(f) = (1 - L_F(f)) T_{\text{Ocean}}(f) + L_F(f) T_{\text{Land}}(f)$$

Brown, 2010







# **Existing methods**

Page 5

Combined MWR - ECMWF -GNSS wet tropo. corr through COASTALT ESA initiative (<a href="http://www.coastalaltimetry.org/">http://www.coastalaltimetry.org/</a>)

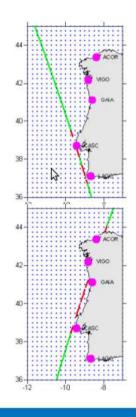
Fernandes, 2010

#### Summary of the method

#### **GPD (GNSS-derived Path Delay)**

Combines the following data sets (objective analysis):

- GNSS-derived zenith Zenith Total Delays (ZTD) at coastal GNSS stations
- Valid MWR measurements
- ☐ ZWD from a Numerical Weather Model, ECMWF (global grids 0.25°×0.25°, every 6h)







## Proposed methodology for RA2-MWR

Page

- RA-MWR: bi-frequency nadir radiometer: 23.8 GHz/36.5GHz
- What do we need? [adapted from Brown 2010]
  - Measured brightness temperatures (mixed Land/Ocean)
  - Measured altimeter backscattering coefficient in Ku band (to take into account surface roughness)
  - Land proportion in the pixel at both frequencies

dh = NN (TB23.8, TB36.5,  $\sigma$ 0\_Ku, land\_prop23.8, land\_prop36.4)

Coastal Neural Net algorithm

- Algorithm formulation
  - Building of the learning database
  - Learning of the neural net





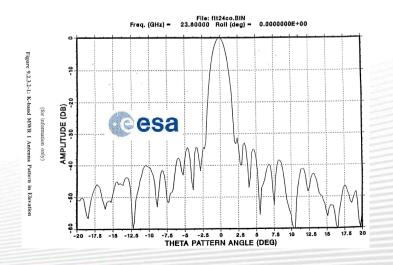
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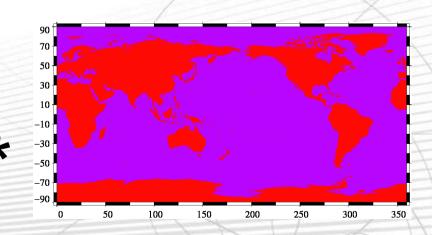
dh =NN (TB23.8, TB36.5,  $\sigma$ 0\_Ku, land\_prop23.8, land\_prop36.5)



#### land proportion

Weighted mean of a 1/30° land sea mask by a sampling of Envisat MWR true antenna pattern









# Land proportion

Page 8



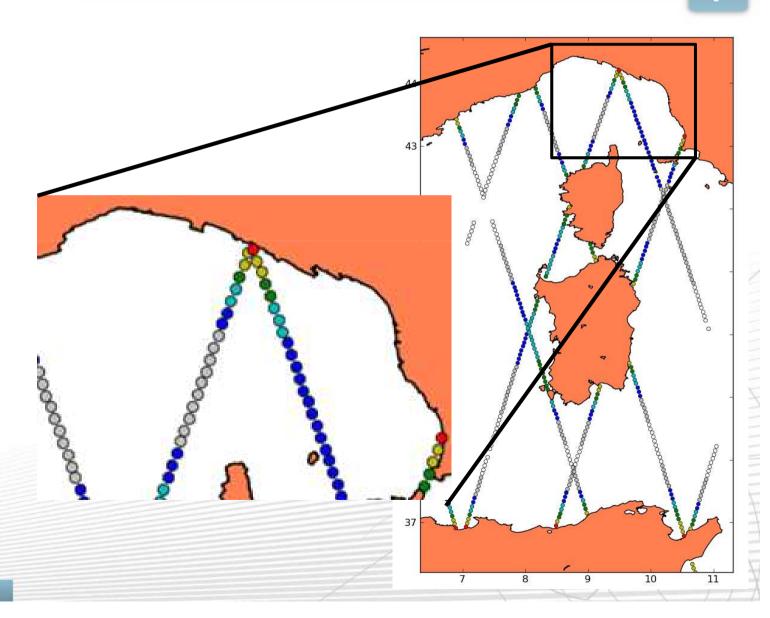
< 0.2

< 0.3

< 0.4

< 0.5

> 0.5





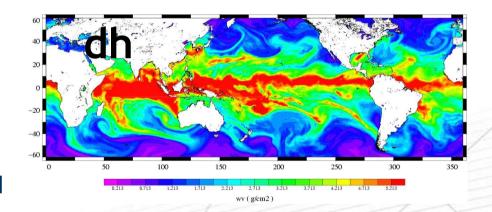


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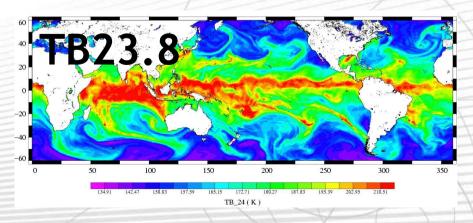
dh =NN (TB23.8, TB36.5, σ0\_Ku, land\_prop23.8, land\_prop36.4)

#### 1rst STEP: simulation of Ocean TBs

A set of ECMWF analyses over sea with wet tropospheric correction, and other needed geophysical parameters: surface temperature and pressure, temperature and humidity profiles, surface wind speed



➤ Simulation over sea of brightness temperatures at 23.8 and 36.5 GHz thanks to a radiative transfer model







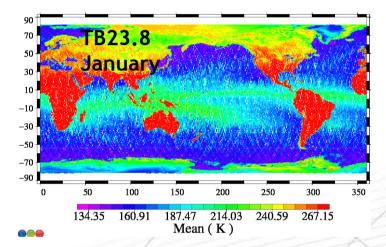
Page 10

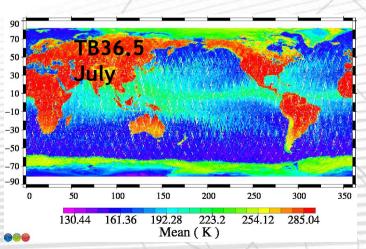
dh =NN (TB23.8, TB36.5, σ0\_Ku, land\_prop23.8, land\_prop36.4)

#### **2nd STEP: simulation of Mixed TBs**

TB\_mixed = (1-LP)\*TB\_Ocean + LP\*TB\_Land

- LP randomnly chosen in a realistic distribution (obtained from one data cycle)
- TB\_Ocean simulated by the radiative transfer model
- •TB\_Land: real measurement randomly picked up in a 10° latitude band









Page 1

dh =NN (TB23.8, TB36.5, σ0\_Ku, land\_prop23.8, land\_prop36.4)



Simulated with the radiative transfer model assuming a sea surface, smaller resolution





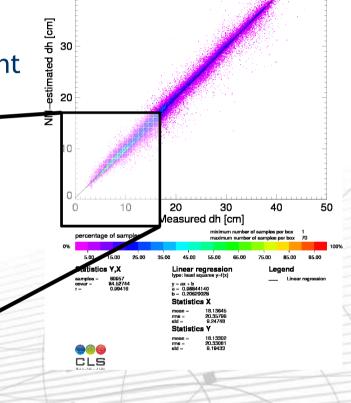
# Algorithm formulation

40

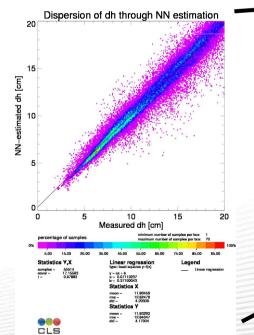
 Neural Net formalism to estimate weights and biases that minimize the differences (bias and rms between estimated and reference dh

Architecture with 1 hidden layer of 8 neurons

→ allows an optimal regression taking into account non linearities



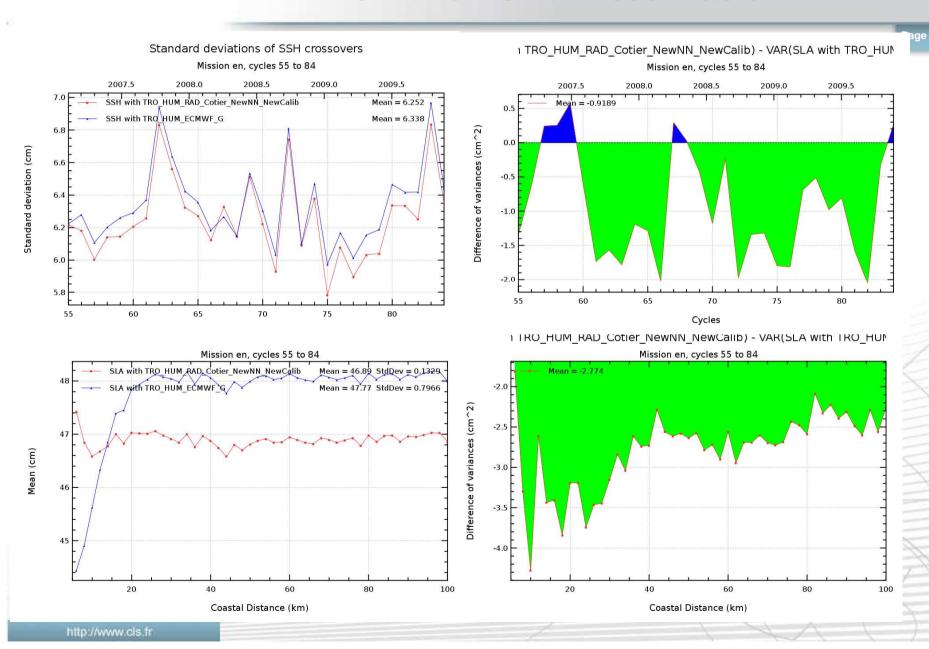
Dispersion of dh through NN estimation







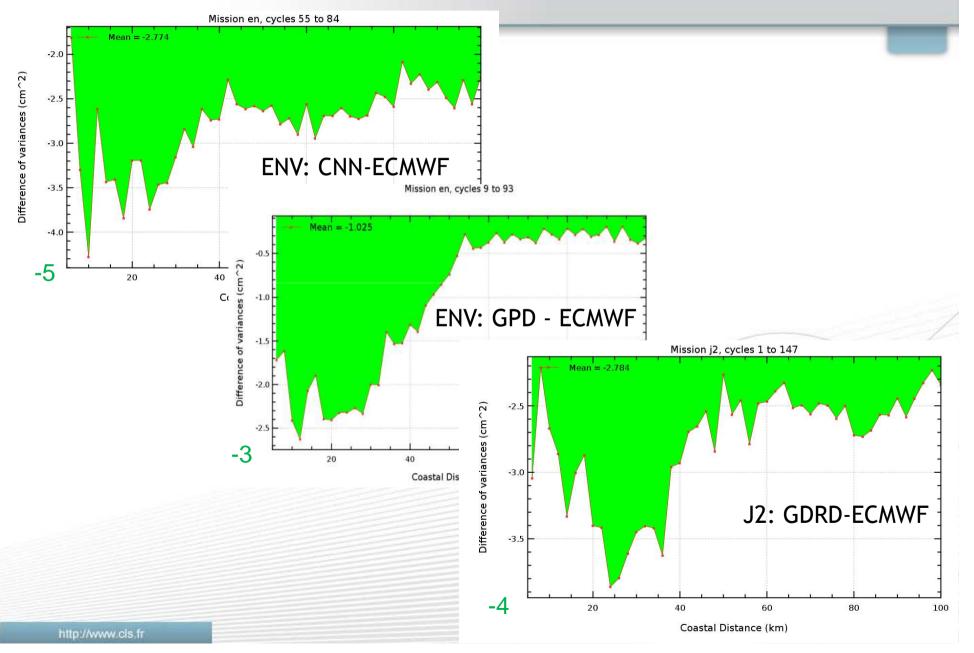
### CNN vs ECMWF estimation







### SLA variance difference vs ECMWF

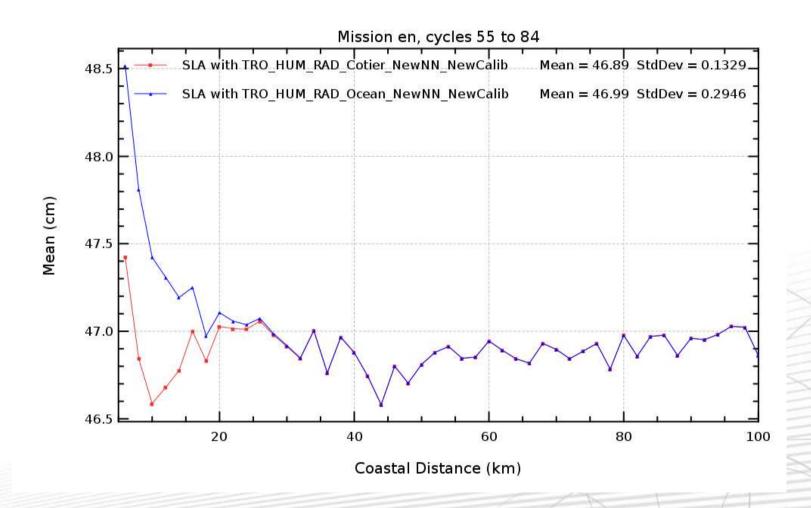






# CNN SLA when approaching the coast

Page 15

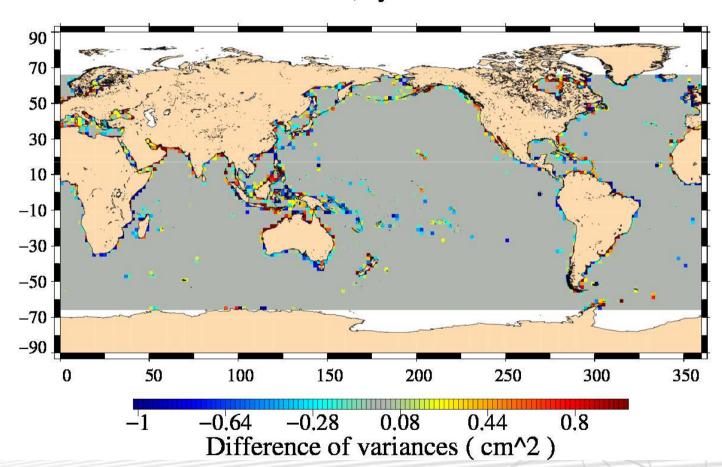






### SLA variance difference vs GDR

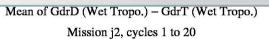
M\_RAD\_Cotier\_NewNN\_NewCalib) - VAR(SLA with TRO\_HUM\_RAD\_C Mission en, cycles 55 to 84



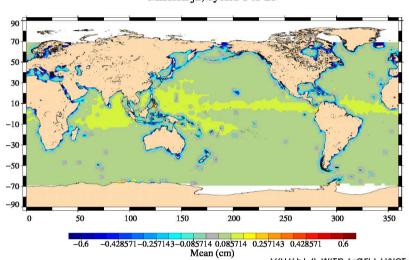


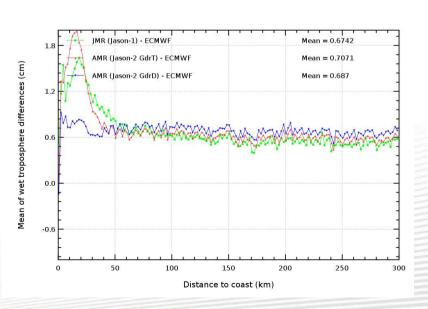


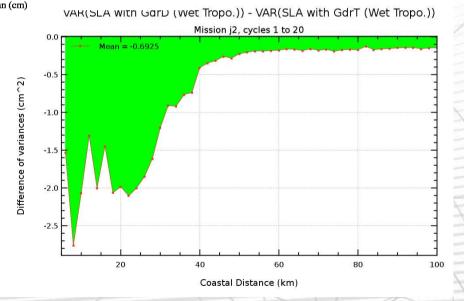
### J2 GDR-D coastal dh



Page 17







SALP, Philipps et al, 2012





## Conclusions & Perspectives

- Future altimetry missions defined to increase resolution and accuracy in altimetry measurements (S3/SRAL, SARAL/AltiKa, SWOT/Karin, ...) => will allow a better characterization of SSH coastal variability
- A global, high resolution and accurate wet tropospheric correction will be needed to take advantage of these new instruments
- Only the radiometer estimation, alone or combined with other products (models, GPS) will allow to reach this goal, models presenting insufficient spatial resolution and poor temporal sampling
- We developed a new algorithm derived from previous studies (Desportes, Brown) to improve the coastal wet tropospheric correction
- NN are used to easily and accurately take into account the required additional geophysical parameters





## Conclusions & Perspectives

- First results show a significant reduction of SLA variance with respect to the model and reduction of standard deviation of SSH at cross-overs
- For future altimetry missions, other aspects of processing and design of the radiometers should be analyzed and possibly improved:
  - Quality of the side-lobe correction (L1 processing)
  - Potential of the "original" measurements of the instrument (7 Hz for Envisat)
  - Review of the interpolation processing between radiometer and altimeter measurement
  - Enhancement of the radiometer resolution either through better antenna or innovative algorithm (currently used in imagery)
  - Potential of high frequency radiometers (higher spatial resolution, much smaller land impact)