

Semi-analytical models for delay/Doppler altimetry

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Summary

- Context / Introduction
- Semi-analytical model (3 parameters)
- Semi-analytical model (5 parameters)
- Conclusions & perspectives

Context

Various solutions to retrack altimeter waveforms

Model

Analytical
solution
(model +
derivatives)

Analytical
solution
(model
without
derivatives)

Semi-Analytical
solution
(double
convolution)

Simulated
numerical
solution
(double
convolution)

Retracking

Newton-
Raphson
iterative
solution

Levenberg-Marquardt solution

Newton-
Raphson
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**BROWN,
Current LRM
processing**

Levenberg-Marquardt solution

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SAMOSA
SAR solution

Echos
Data Base

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CNES CPP
SAR solution

Introduction

- 3 parameter study
 - ▶ Description of the semi-analytical model
 - ▶ Parameter estimation
- 5 parameter study
 - ▶ Description of the semi-analytical model
 - ▶ Parameter estimation

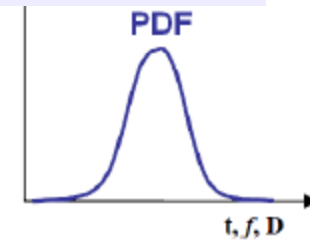
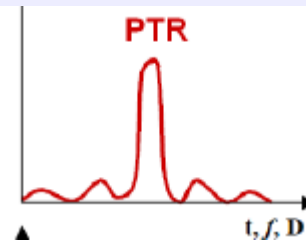
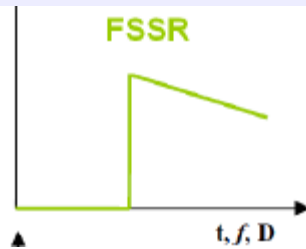
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3 parameters (DDA3)

Conventional altimetry

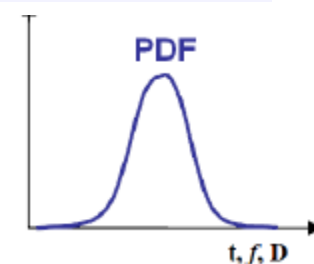
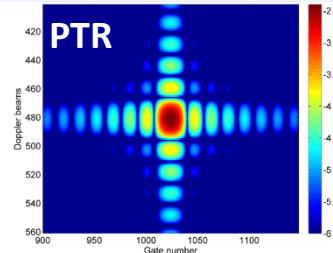
$$P(t) = \text{FSSR}(t) \otimes \text{PTR}(t) \otimes \text{PDF}(t)$$



Doppler altimetry^{2 3}

$$P(t, n) = \text{FSSR}(t, n) \otimes \text{PTR}(t, n) \otimes \text{PDF}(t)$$

- n : Doppler band or frequency



3 parameters (DDA3)

$$P(t, f) = \text{FSIR}(t, f) * \text{PDF}(t) * \text{PTR}(t, f)$$

$$\text{FSIR}(t_k, n) = P_u \exp \left[-\frac{4c}{\gamma h} t_k \right] \left[\frac{\phi_{k,n+1}(t_k) - \phi_{k,n}(t_k)}{\pi} \right] U(t_k)$$

- ▶ $t_k = kT - \tau_s$
- ▶ $k = 1, \dots, KN_t$ with $K = 128$
- ▶ $n = 1, \dots, NN_f$ with $N = 64$ beams
- ▶ $\phi_{k,n} = \text{Re} \left[\arctan \left(\frac{y_n}{\sqrt{\rho^2(t_k) - y_n^2}} \right) \right]$
- ▶ $y_n = \frac{h\lambda}{2v_s} f_n$
- ▶ $\rho(t_k) = \sqrt{hct_k}$

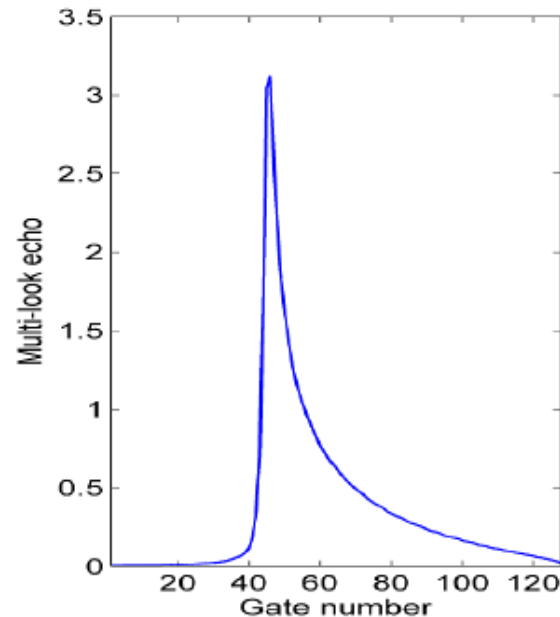
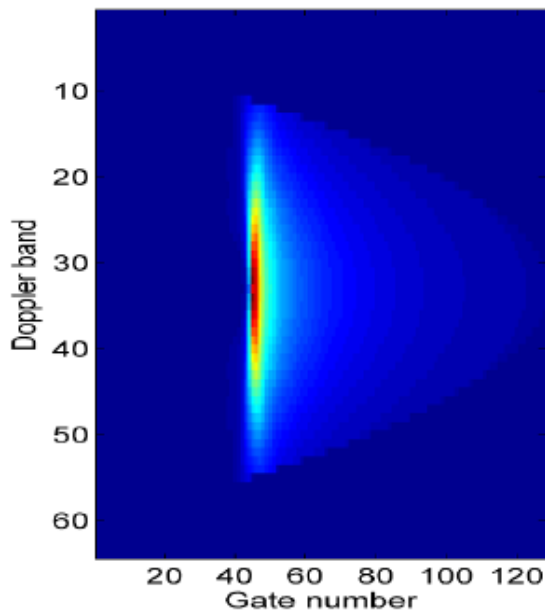
3 parameters (DDA3)

Multi-look echo

$$P(t, n) = \text{FSSR}(t, n) \otimes \text{PTR}(t, n) \otimes \text{PDF}(t)$$

$$s(t) = \sum_{n=1}^{64} P[t - \delta t(n), n]$$

Geometrical migration correction



Parameter Estimation

- Least squares estimation

$$\underset{\boldsymbol{\theta}}{\operatorname{argmin}} F(\boldsymbol{\theta}) = \underset{\boldsymbol{\theta}}{\operatorname{argmin}} \frac{1}{2} \sum_{k=1}^K [y_k - s_k(\boldsymbol{\theta})]^2$$

- ▶ $\mathbf{y} = (y_1, \dots, y_K)^T$ is the observed multi-look echo
- ▶ $\mathbf{s} = (s_1, \dots, s_K)^T$ is the proposed model
- ▶ $\boldsymbol{\theta} = (P_u, \text{SWH}, \tau_s)^T$ is the parameter vector to estimate

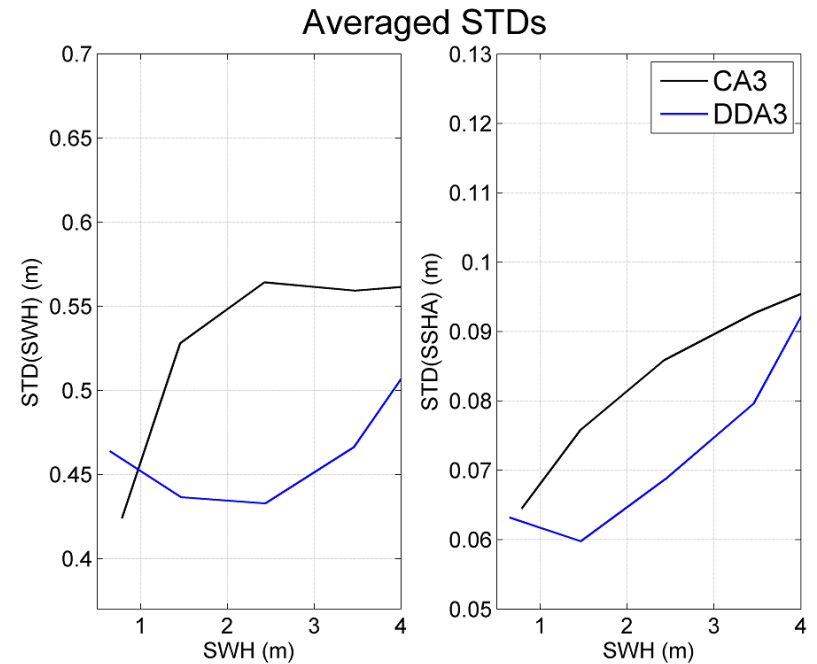
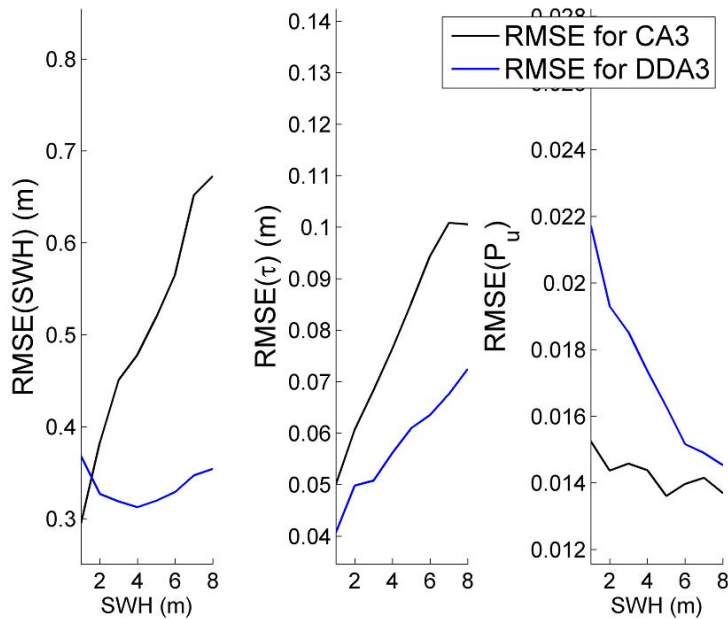
- Levenberg-Marquardt algorithm

Simulation Results

Already presented at OSTST 2012

Synthetic data

Real data



Improvement factor at **SWH = 2 m**

1.19 for **SWH**

1.24 for **τ**

1.28 for **SWH**

1.26 for **τ**

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5 parameters (DDA5)

$$\text{FSIR}(k, n) = \frac{P_u}{2\pi} \left(1 + \frac{ct_k}{2h}\right)^{-3} U(t_k) \times \left\{ \int_{\phi_{k,n}}^{\phi_{k,n+1}} \exp \left\{ f \left[\tilde{\phi} - \phi, \epsilon(k), \xi \right] \right\} d\phi + \int_{\phi'_{k,n}}^{\phi'_{k,n+1}} \exp \left\{ f \left[\tilde{\phi} - \phi, \epsilon(k), \xi \right] \right\} d\phi \right\}$$

with

$$f \left[\tilde{\phi} - \phi, \epsilon(k), \xi \right] = -\frac{4}{\gamma} \left[1 - \frac{\cos^2(\xi)}{1 + \epsilon^2(k)} \right] + b(k, \xi) + a(k, \xi) \cos(\tilde{\phi} - \phi) - b(k, \xi) \sin^2(\tilde{\phi} - \phi)$$

- ▶ ξ and $\tilde{\phi}$ represents the antenna mispointing angles
- ▶ $a(k, \xi) = \frac{4\epsilon(k)}{\gamma} \frac{\sin(2\xi)}{1 + \epsilon^2(k)}$ and $b(k, \xi) = \frac{4\epsilon^2(k)}{\gamma} \frac{\sin^2(\xi)}{1 + \epsilon^2(k)}$.

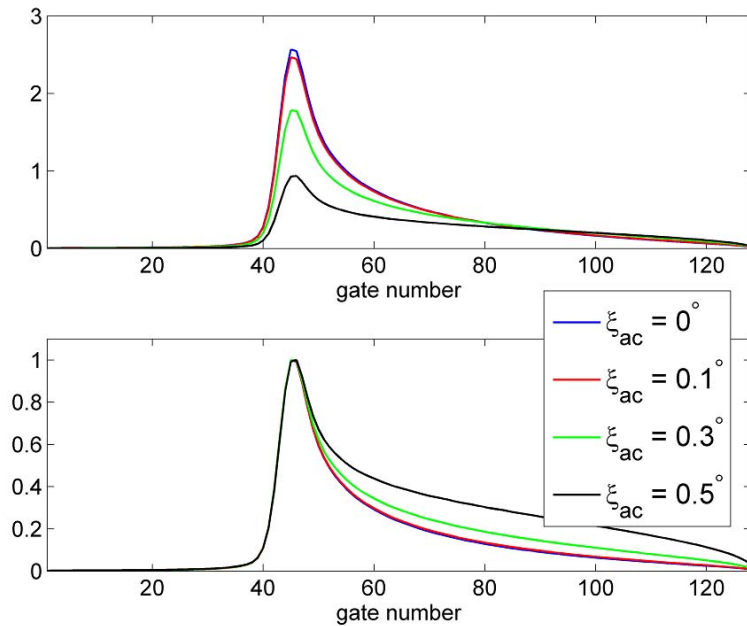
● ξ and $\tilde{\phi}$ are the mispointing angles (related to ξ_{ac} and ξ_{al})

5 parameters (DDA5)

● Effects of across-track and along-track mispointing

Already observed by Gommenginger, OSTST - 2011

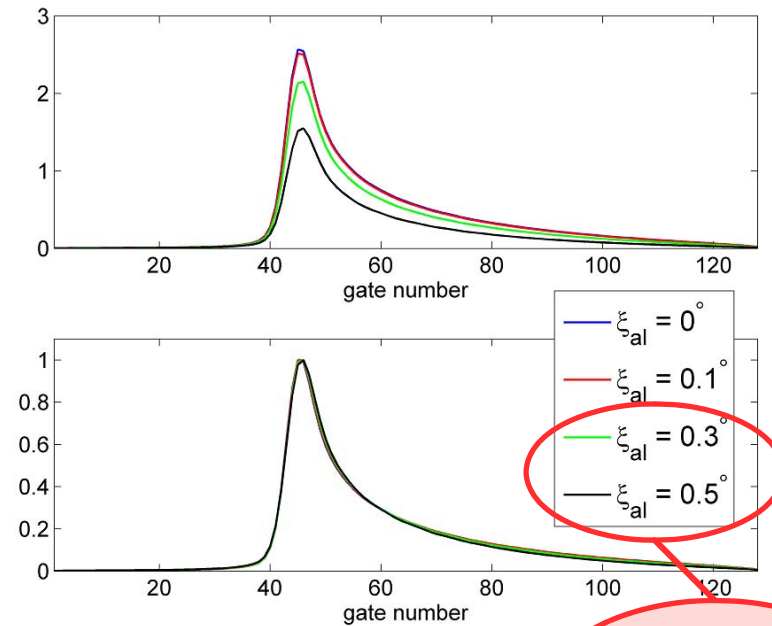
Effect of ξ_{ac}



Changes the
Shape and the Amplitude

Effect of ξ_{al}

Normalized echos



Changes
the Amplitude

Parameter Estimation

- Least squares estimation
- Levenberg-Marquardt algorithm
- Scenarios

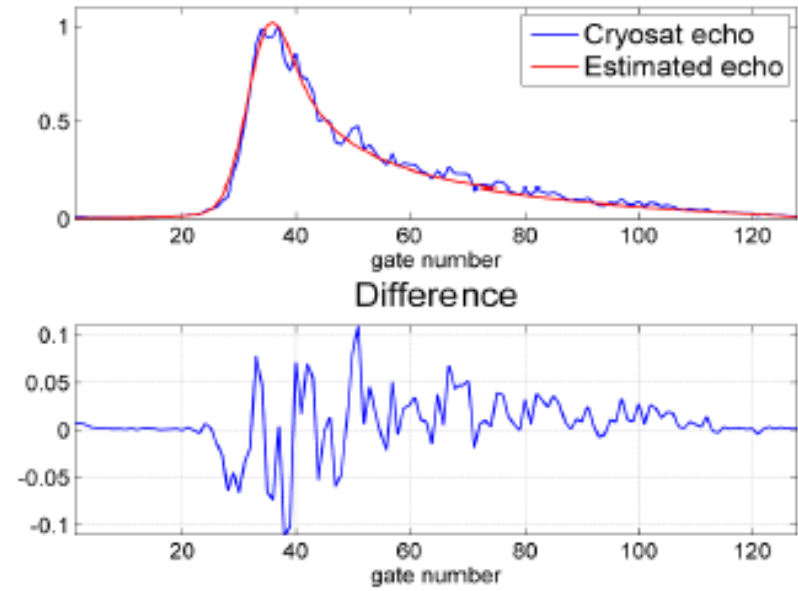
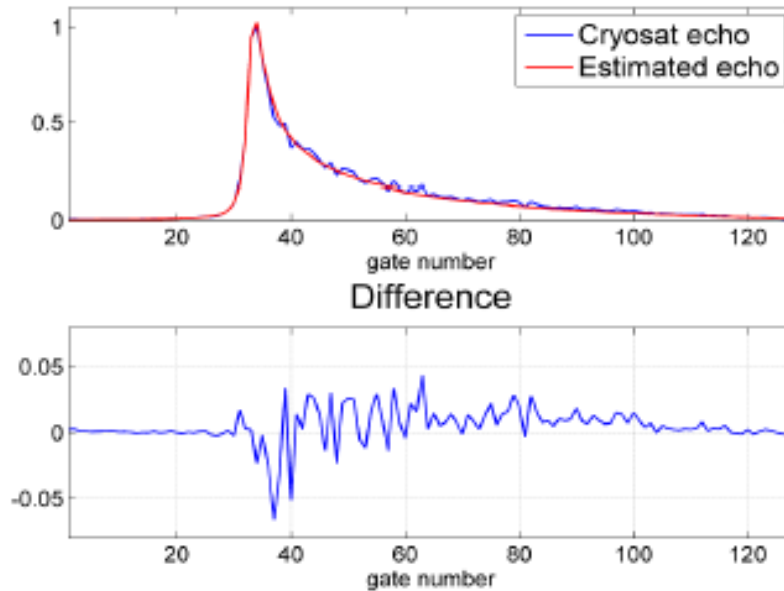
▶ DDA3: $\boldsymbol{\theta} = (\text{SWH}, \tau, P_u)^T$ et $\xi_{\text{al}} = \xi_{\text{ac}} = 0^\circ$

▶ DDA4: $\boldsymbol{\theta} = (\text{SWH}, \tau, P_u, \xi_{\text{ac}})^T$ et $\xi_{\text{al}} = 0^\circ$

▶ DDA5: $\boldsymbol{\theta} = (\text{SWH}, \tau, P_u, \xi_{\text{ac}}, \xi_{\text{al}})^T$

ξ_{al} and ξ_{ac} can be introduced (if known from STR) as input parameters of DDA3 or DDA4

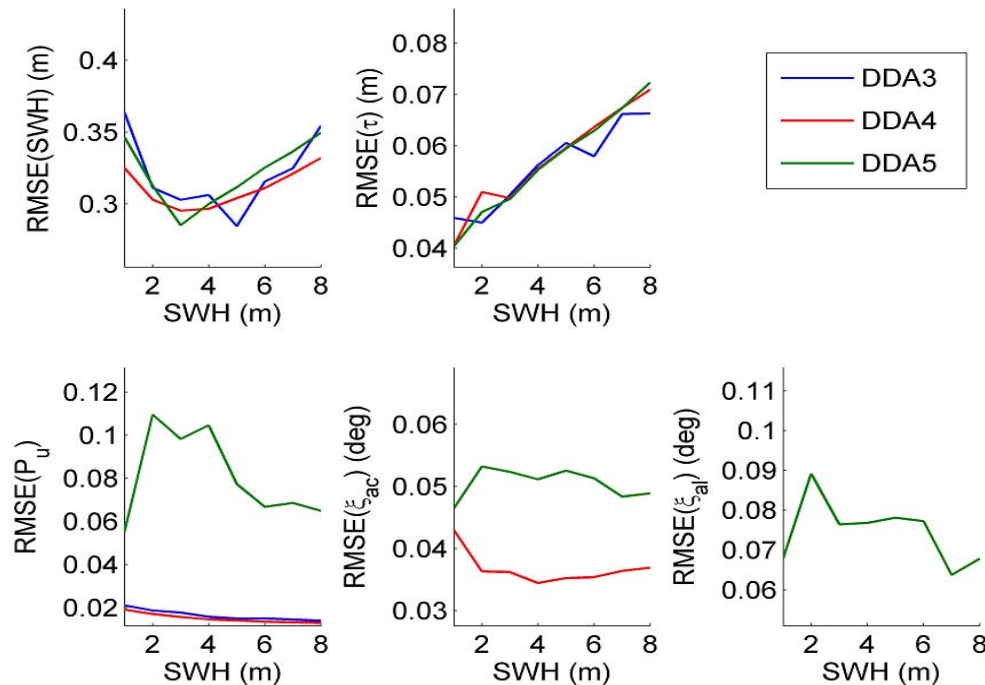
Fit on real data (CS-2)



NRE = Normalized Reconstruction Error

- Very good fit between CS-2 waveforms and Halimi model for all SWH
 - At the toe
 - on the leading edge
 - on the tail of the echo

Results for simulated data

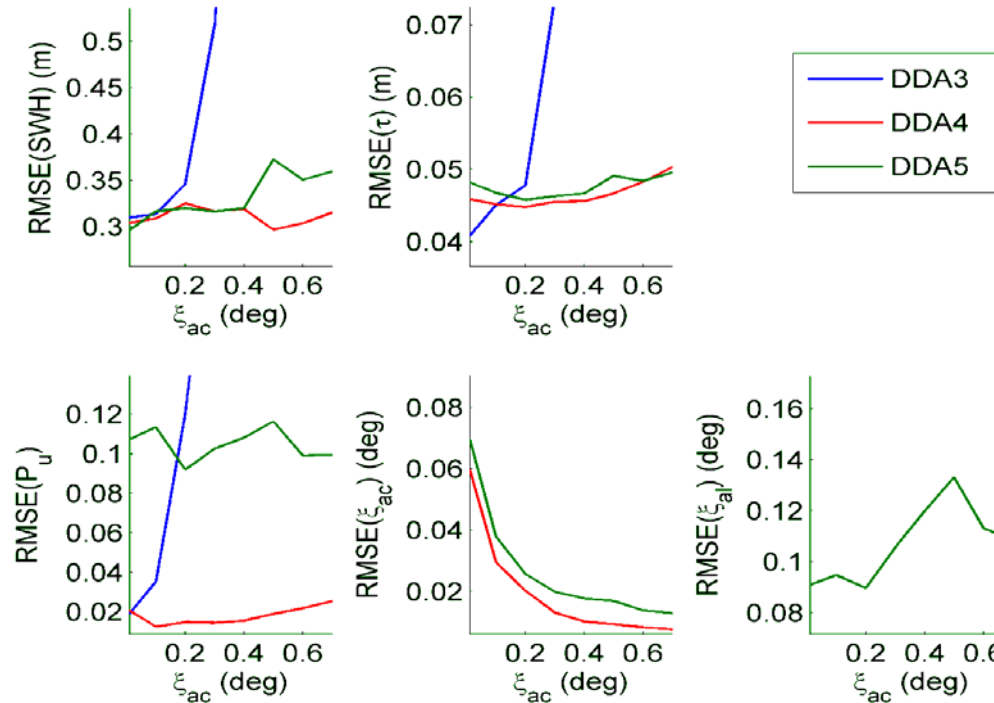


- RMSEs as a function of **SWH**

Parameters: $P_u = 1$, $\tau = 31$ gates, $\xi_{al} = 0^\circ$ and $\xi_{ac} = 0^\circ$.

- DDA3 and DDA4 are consistent and provide good performance
DDA5 has degraded performances due to the strong P_u/ξ_{al} correlation

Results for simulated data



- RMSEs as a function of ξ_{ac}

Parameters: $P_u = 1$, $SWH = 2$ m, $\tau = 31$ gates and $\xi_{al} = 0^\circ$.

- Significant errors on estimations with unknown mispointing angles

		τ (m)	SWH (m)	P_u	ξ_{ac} (deg)	ξ_{al} (deg)	ξ (deg)
STDs (20 Hz)	DDA3	0.0843	0.355	1.933	-	-	-
	DDA4	0.0827	0.351	1.871	0.031	-	0.031
	DDA5	0.0828	0.416	13.446	0.0413	0.0922	0.0866

Standard deviations for DDA3, DDA4
and DDA5 algorithms.

- Better results with DDA4 solution

$$\theta = (\text{SWH}, \tau, P_u, \xi_{ac})^T \text{ et } \xi_{al} = 0^\circ$$

- DDA5 has lower performances due to the strong P_u/ξ_{al} correlation

Conclusions & Perspectives

Conclusions

- A new semi-analytical Delay/Doppler Altimetry model has been defined and validated (DDA3 published, DDA5 to be published)
- Delay/Doppler altimetry provides increased precision than conventional altimetry
- Accounting for antenna mispointing improves the performances of the model especially for high mispointing angles
- DDA4 more robust than DDA5
- On stacked echos, along track mispointings are required to remove ambiguity with P_u

Perspectives

- To perform a full calval activity on CS-2 data and cross comparison with CPP and other solutions ...
- To improve the estimation by considering the delay/doppler matrix instead of the mutli-look echo (ξ_{al} from STR or derived from the 2D delay/doppler map)