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Why coastal winds

- Scientific applications:
 - Weather forecasts (ocean and atmosphere)
 - Coastal dynamics (Diffusion, extreme events such as Acqua Alta, etc.)
 - ...
- Civil applications:
 - Wind farm installation
 - Coastal erosion
 - ...

Scatterometer-derived winds represent the gold standard, but... Land contamination causing wind biases within $\approx\!\!25~\text{km}$

SeaWinds on QuikSCAT and ADEOSII



• Ku-band (13.4 GHz)

- Inner beam: H-Pol
- Outer beam: V-Pol
- 4 "views" per each ocean point:
 - H-fore
 - H-aft
 - V-fore
 - V-aft

M. W. Spencer, Chialin Wu and D. G. Long, "Tradeoffs in the design of a spaceborne scanning pencil beam scatterometer: application to SeaWinds," in IEEE Transactions on Geoscience and Remote Sensing, vol. 35, no. 1, pp. 115-126, Jan. 1997, doi: 10.1109/36.551940.

SeaWinds egg (Inner beam example)



Model of land-contaminated σ_0

$$\sigma_0 = (1-f) \ \bar{\sigma}_{0,S} + f \ \bar{\sigma}_{0,L} + \underbrace{\left[(1-f) \ \epsilon_S(\sigma_{0,S}) + f \ \epsilon_L(\sigma_{0,L}) \right]}_{\epsilon}$$

• $\bar{\sigma}_{0,S}$, $\bar{\sigma}_{0,L}$, ϵ_S and ϵ_L are unknown

State of the art

 σ
_{0,L} estimated from the SeaWinds climatological series [1] or enhanced res.algorithm [2]

•
$$\hat{\overline{\sigma}}_{0,S} = \frac{\sigma_0 - f \ \overline{\sigma}_{0,L}}{1 - f}$$

 Fore, A.G.; Stiles, B.W.; Strub, P.T.; West, R.D. QuikSCAT Climatological Data Record: Land Contamination Flagging and Correction. Remote Sens. 2022, 14, 2487. https://doi.org/10.3390/rs14102487
 Soisuvarn, S., Jelenak, Z., Chang, P.S., Zhu, Q., Shoup, C.G., 2023. High-resolution coastal winds from the noaa near real-time ascat pro- cessor. IEEE Transactions on Geoscience and Remote Sensing 61, 1–12. doi:10.1109/TGR5.2023.3279764.

Noise regularization procedure:

1. $\sigma_{0} = \underbrace{\bar{\sigma}_{0,S}}_{b} + \underbrace{(\bar{\sigma}_{0,L} - \bar{\sigma}_{0,S})}_{a} f + \epsilon [3]$ 2. $\bar{\sigma}_{0,f} = af + \bar{\sigma}_{0,S}$ 3. $\bar{\sigma}_{0,f} \rightarrow \hat{K}_{p}(\bar{\sigma}_{0,f})$ 4. CDF matching: $F_{\bar{\sigma}_{0,f},\hat{K}_{0,f}}(\tilde{\sigma}_{0,f}) \equiv F_{\bar{\sigma}_{0,S},\hat{K}_{0,S}}(\tilde{\sigma}_{0,S})$

[3] J. Vogelzang, A. Stoffelen, "ASCAT land correction", SAF/OSI/CDOP3/KNMI/TEC/TN/384



Area test: north Adriatic (Mediterranean basin)



QuikSCAT Full-Resolution file ID 40653

corrected σ_0 with noise regularization





Residual land contamination due to lack of $\sigma_{0,S}$



QuikSCAT Full-Resolution file ID 40653

Name	f th	Noise regularization	Orbit IDs
CTRL	0.02	NO	40651-40664
NC	0.5	NO	40651-40664
NR	0.5	YES	40651-40664

CTRL represents the state-of-the-art at OSI-SAF

- Two area tests: North Adriatic (Mediterranean) and Netherlands
- Day: 10th April 2007
- WVC grid: 12.5 km

Retrieved winds: North Adriatic



NC

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CTRL

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NR

Retrieved winds: Netherlands



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NC

NR

12

Sampling rate improvement



w.r.t. CTRL

w.r.t. NC

Envisat ASAR-derived winds

- Wind direction:
 - Method: Deep Learning with Convolutional Neural Network (CCN) with Residual Neural Network structure (ResNet)
 - Configuration: 4 layers, 64 channels
 - Training dataset of **816,000** pairs:
 - 25 Sentinel 1 GRDW IW images
 - ECMWF FC 0.125°
- Wind speed:

• $U=C_SarMod2^{-1}(\sigma_0,\theta)$ (Lu et al. 2018)

Zanchetta and Zecchetto, "Wind direction retrieval from Sentinel-1 SAR images using ResNet", Remote Sensing of Environment, 253, 2021 (https://doi.org/10.1016/j.rse.2020.112178)



ASAR-derived winds



 $\sigma_{0,ASAR}$ IOVWST 2023, Nanjing, 30 th Nov

Comparison between QuikScat and Envisat derived winds



 $\vec{u}_{ASAR}^{12.5}$ vs $\vec{u}_{QS}^{12.5}$ Black markers: rainy WVCs

Preliminary Conclusions & Future Work

Preliminary conclusions

- σ_0 correction with noise regularization is effective
- Wind retrievals are good, also in internal seas
- Coastal sampling gain: +400% within 5 km and ${\approx}300\%$ within 10 km
- Encouraging agreement with SAR-derived winds

Future work

- MLE threshold tuning
- Assessment of any residual contamination
- Validate winds (how? Against buoys, models, SAR-derived winds?)
- Improve ResNet-derived winds and consistency with QS winds

• Export Noise-Reg to other pencil-beam scats (OceanSat, HY-2) $_{\rm IOVWST\ 2023,\ Nanjing,\ 30^{th}\ Nov}$

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Back-up slides