# Aquarius' CAP Ocean Surface Salinity and Wind Products and Their Applications to Water Cycle Research

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- Introduction
- CAP V2.0 Algorithm Validation
  - Triple Collocations
  - Validation Using ARGO
- An example for application to water cycle research
- Summary





Radiometer Model Function

 $T_{Bp}(SSS, SST, w, \phi) = T_{Bp0}(SSS, SST) + SST \cdot [e_{p0}(w, SWH) + e_{p1}(w)\cos\phi + e_{p2}(w)\cos 2\phi]$ 

Scatterometer Model Function

$$\sigma_{p}(w, SWH, \phi) = A_{0p}(w, SWH)[1 + A_{1p}(w)\cos\phi + A_{2p}(w)\cos 2\phi]$$

- Two versions of GMFs are built
  - AQ data, SSM/I wind speed, NCEP wind direction, NOAA WW3 SWH
  - AQ data, NCEP wind speed, NCEP wind direction, NOAA WW3 SWH





- Combined Active-Passive (CAP) Algorithm
  - Retrieve SSS, Wind Speed and Direction Using Combined Passive and Active Data
  - Do not use NCEP winds for TB correction
  - Can be easily updated to account for additional corrections

$$F_{pol}(SSS,W,\phi) = \frac{(I - I_m)^2}{2\Delta T^2} + \frac{(\sqrt{Q^2 + U^2} - \sqrt{Q_m^2 + U_m^2})^2}{2\Delta T^2} + \frac{(\sigma_{0VV} - \sigma_{0VVm})^2}{(k_p \sigma_{0VV})^2} + \frac{(\sigma_{0HH} - \sigma_{0HHm})^2}{(k_p \sigma_{0HH})^2}$$

$$Q = T_{BV} - T_{BH}$$

$$I = T_{BV} + T_{BH}$$
Yueh and Chaubell, IEEE TGRS, April 2012

 V2.0 modification to constrain wind speed retrieval at crosswind and direction retrieval for light-mid winds

$$F_{ap}(SSS, w, \phi) = \frac{(T_{BV} - T_{BVm})^2}{\Delta T^2} + \frac{(T_{BH} - T_{BHm})^2}{\Delta T^2} + \frac{(\sigma_{VV} - \sigma_{VVm})^2}{k_{pc}^2 \sigma_{VV}^2} + \frac{(\sigma_{HH} - \sigma_{HHm})^2}{k_{pc}^2 \sigma_{HH}^2} + \frac{(w - w_{NCEP})^2}{\Delta w^2} + \frac{\sin^2((\phi - \phi_{NCEP})/2)}{\delta^2}$$





 Please check out Wendy's poster on rain effects and correction, which removes the bias with respect to ARGO





# Aquarius SSS, Wind and Soil Moisture Products





Aquarius soil moisture from Jackson and Bindlish





• Two sets of triple collocation analyses indicate that CAP's wind speed accuracy is comparable to those of SSMIS and QuikSCAT.

	Bias	Slope	RMS Error
SSMI	0	1	0.6516
QuikSCAT	0.4154	0.9714	0.8639
CAP 2.0	-0.1615	1.0452	0.7616

	Bias	Slope	RMS Error
SSMI	0	1	0.7133
ECMWF	0.213	0.9644	0.8290
CAP 2.0	-0.270	1.0465	0.6967



Triple Collocated SSS: ARGO, HYCOM, L2/CAP (2011), <r<sub>1</sub>r<sub>2</sub>>=<r<sub>1</sub>r<sub>3</sub>>=0

	ARGO	НҮСОМ	L2
Beam 1; Bias	0	4.4533	0.6572
Beam 2; Bias	0	4.4759	0.8506
Beam 3; Bias	0	4.5999	2.5117
Beam 1; Slope	1	0.8724	0.9825
Beam 2; Slope	1	0.8719	0.9771
Beam 3; Slope	1	0.8684	0.9307
Beam 1; Error	0.1708	0.1585	0.4382
Beam 2; Error	0.1656	0.1734	0.4049
Beam 3; Error	0.1549	0.1780	0.4457

Land & ice\_frac <= 0.0005



## Monthly Averaged CAP-APDRC









- There are differing systematic biases with respect to HYCOM and APDRC
- CAP GMF was trained using Aquarius-HYCOM matchups
  - Need to be retrained to take out the bias







- Mostly between 0.1 to 0.2 psu
- Reaching 0.3 to 0.5 psu for cold waters (high latitudes)

Aquarius CAP-APDRC\_ARGO SSS Std Deviation 201109-201301 L2\_SCI\_V2.0cap\_r1





# Zonal Averaged Errors Comparison with APDRC



- There is about 0.1 psu mean bias globally CAP model was trained using HYCOM matchup
- Global average of s.d. for various CAP versions is about 0.21 psu







- Land fraction < 0.0005
- The CAP with rain correction retrieval has the smallest standard deviation (best accuracy).

Products	Global mean of standard deviation of differences of monthly averages (psu)
L2-APDRC	0.302
CAP-APDRC (SSMIS, no rain correction)	0.217
CAP-APDRC (NCEP, no rain correction)	0.218
CAP-APDRC (NCEP, rain correction)	0.215



# Application of Aquarius data to Water Cycle Observations Salinity and Soil Moisture





 Changes of SSS and soil moisture illustrate the water cycle in the Bay of Bengal and the Indian subcontinent.



#### **Good Temporal Correlation with ARGO**









- The time series of river discharge reflects the change of soil moisture rain starting in March
- The drop of salinity in box 5 lags the change of river discharge by about 3 months (March to June)
  - Box 5 is about 200 km from the mouth of Ganga river
- The increase of salinity in box 5 corresponds well with the drop of river discharge







- The Aquarius CAP monthly averaged salinity product
  - About 0.24\* psu RMS difference wrt ARGO (ADPRC)
    - \*after debiasing 0.1 psu (Hycom's artifacts?)
    - · CAP's RMS error is estimated to be

$$0.17 = \sqrt{0.24^2 - 0.17^2}$$

- Assume 0.17 psu error in ARGO based on triple collocation analysis
- Aquarius SSS, wind and soil moisture together with the altimeter river discharge provide a rich picture of water cycle
- HYCOM is probably inadequate for calibration drift correction and algorithm development for Aquarius any more.





- Incorporate rain correction
- Improve galactic reflection correction -> Ascending-descending bias
- Improve Faraday rotation correction -> regional and global bias
- Include X-pol scatterometer sigma0 for roughness correction -> high latitudes
- Improve land contamination correction





- After effective beamwidth adjustment
- Retrieval biases (28 day average) vary over time
- Improvement: Asc-Des biases are reduced in May-August 2012
- Not much change in Sept-Oct 2011







- Aquarius CAP (combined active-passive) product processed at JPL:
  - SSS
  - Wind speed
  - Wind direction
- CAP V2.0 L2 and L3 products available at PO.DAAC
  - http://podaac.jpl.nasa.gov/SeaSurfaceSalinity
  - Follow the FTP Data Access link for Aquarius data





- Gaussian Geometric Optics model appears fairly reasonable
- Tuning in the Gaussian slope allows some improvement
- The residual may have small dependence on SWH and wind speed
- The residual appears to depend on antenna beam (incidence angle) and polarization
  - Diffuse scattering effects?
- Will start to explore non-Gaussian angular distribution (K) for bistatic scattering coefficients

$$\Delta T_{Bg} = R \int K(\theta_x, \theta_y) T_{sky}(\theta_x, \theta_y) d\theta_x d\theta_y$$



## Galactic Reflection and Gaussian GO Model (July 2012)









## Galactic TB Reflection Scatter Doy 194-200, 2012



- There is a small departure from linear
- H-pol residual has a small dependence on wind speed and SWH



ΔSSS for Day 200 and Beam 2



### Galactic TB Reflection Scatter Doy 194-200, 2012



- Readjusted the effective beamwidth to remove the small departure from linear
- V- and H-pol residuals have a small dependence on wind speed and SWH



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![](_page_25_Picture_0.jpeg)

## Galactic Reflection and Ascending-Descending Bias

![](_page_25_Picture_2.jpeg)

- The Geometry Optics model for galactic reflection does not seem to behave consistently throughout the year
- The following charts illustrate the difference between data and model for v and h polarizations. Model appears to overestimate for descending passes

![](_page_25_Figure_5.jpeg)

 $\Delta T_{\rm Bgr}$  for Day 256 and Beam 2