### Properties of Residual EM Bias Error

Karl F. Warnick, Floyd W. Millet and David V. Arnold Department of Electrical and Computer Engineering Brigham Young University

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Residual error = remaining bias after correction by empirical parametric or nonparametric wind/wave model:

Residual error = bias - meanbias(U,H)

Due to finite fetch effects, multiple wave trains, etc., *U*,*H* pair does not uniquely specify sea state and hence residual EM bias variability remains.

Goal: Study correlation of residual error with *U*,*H* using *in situ* tower bias measurements.





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## RMS residual bias error



Residual error in wind speed/SWH bins after correction by nonparametric model fit to tower data Shaded areas indicate low data density





Use physics-based model with an additional sea state parameter (RMS long wave slope) to study residual error.

Theoretical form of EM bias:

$$Bias = -\gamma(U, H)SH$$

S = RMS long wave slope (cutoff = 2.4 m)H = Significant wave height (SWH)

Theory:  $\gamma \approx \text{constant} (0.6)$ , determined by small wave spectrum

Empirical: fit  $\gamma(U,H)$  to tower data set using *low order* polynomial model

# Empirical fit of model coefficient



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### Fit of $\gamma(U,H)$ to tower data set •Dependence is simple - nearly linear in SWH



#### Parametric fit (second order polynomial) Overlaid on histogram of wind speed/SWH measurements

Nonparametric fit Shaded areas indicate low data density

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### Physics-based model - results







•Parametric physics-based model is nearly as good as nonparametric model, with the benefit of more smoothing and less noise sensitivity

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## Residual vs. RMS slope





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- RMS slope explains much of residual variability
- Vertical spread gives magnitude of residual error in each wind/wave bin
- Horizontal spread is variability of RMS slope
- Slope of line fit gives sensitivity of bias to RMS slope



Goal: Study correlation of environmental state with wind speed, SWH, bias Co-located SeaWinds-on-Quikscat wind speed measurements

•Temporal collocation within 30 minutes



Sample orbit passes of Jason-1 (red), SeaWinds, and TRMM



Jason-1 wind speeds overlaid on SeaWinds Pink shows differences greater than 2m/s •Discrepancies are correlated with mesoscale wind field/rain features

## Conclusions



- cm-order residual bias variability remains after correction by mean bias at a given wind speed/SWH
- RMS long wave slope explains much of this residual variability
- Variability and sensitivity to RMS slope is correlated with sea state
- Variability may also be correlated with mesoscale environmental features