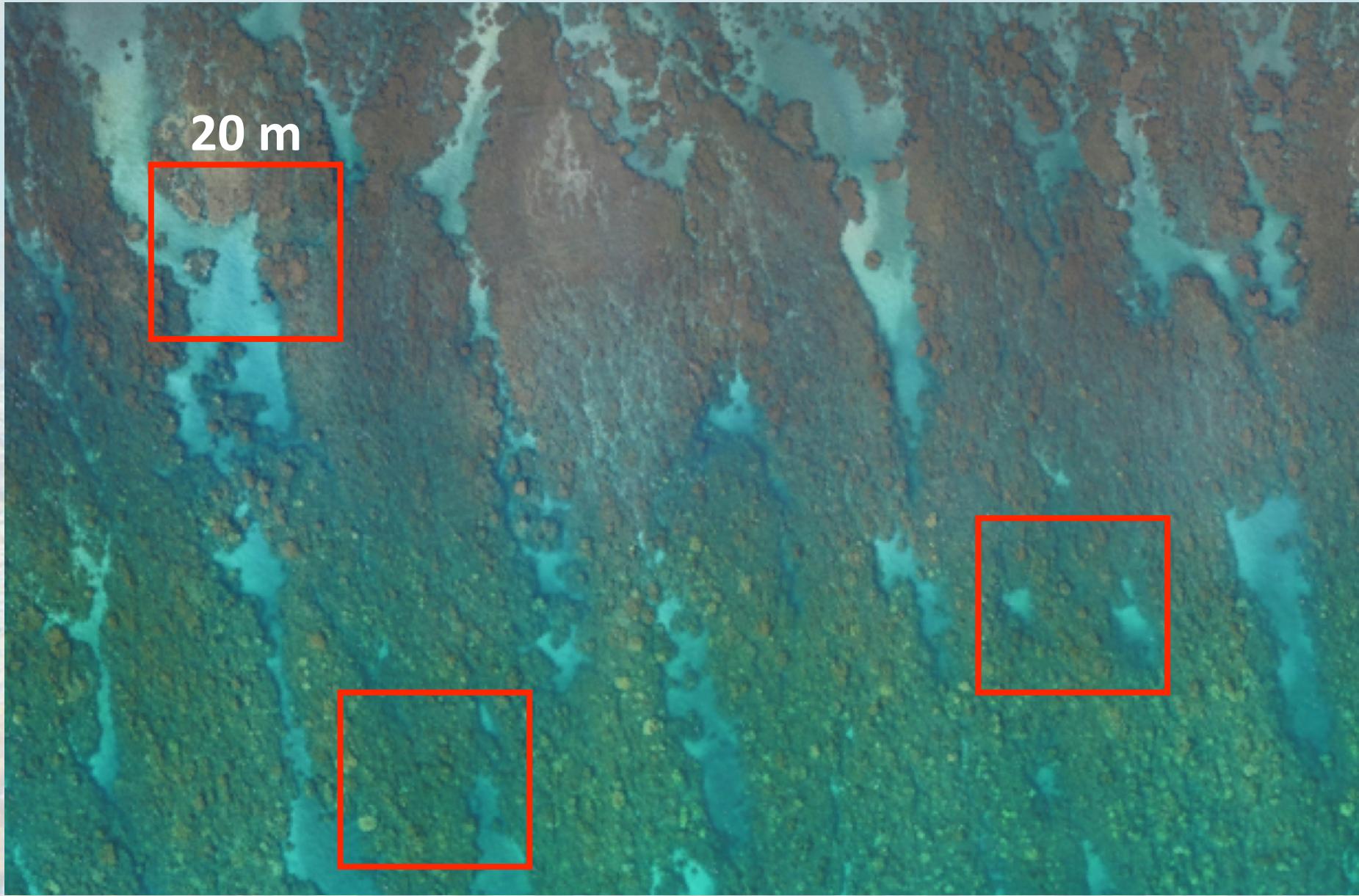


# Using HyspIRI to Identify Benthic Composition in Shallow Coral Reef Ecosystems



Tom Bell  
PIs: Kyle Cavanaugh & Greg Okin





20 m

# Overarching Project Goals

Will the spectral characteristics of HyspIRI-like data allow for the accurate retrieval of reef benthic composition?

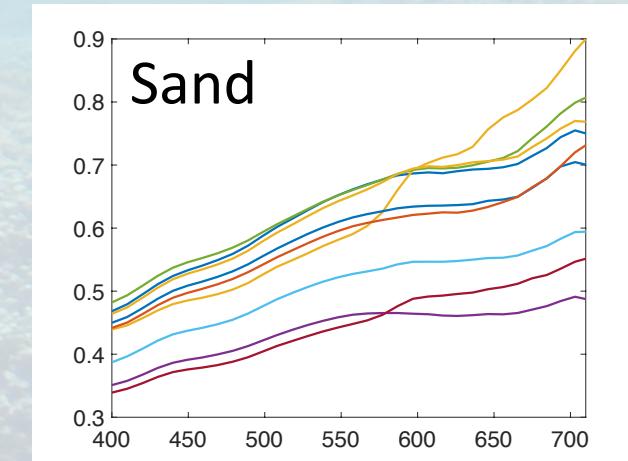
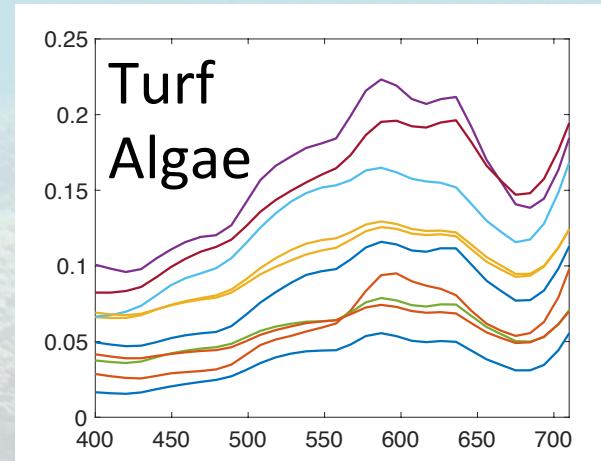
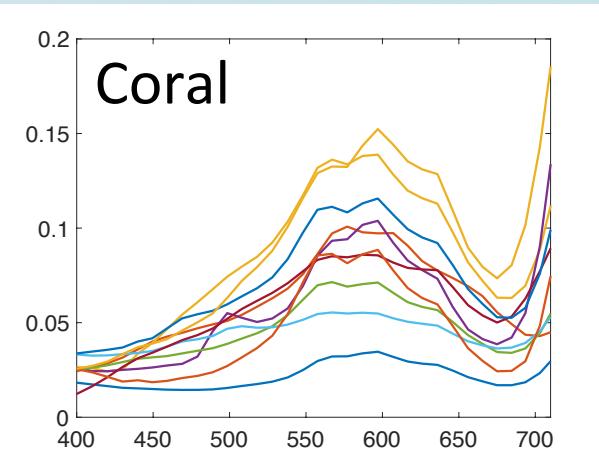
1. **Simulation analysis** to characterize the practical limits of discrimination of coral reef benthic composition.
  
2. **Validation** of benthic fractions from AVIRIS imagery using field observations.

# Questions – Simulation Analysis

- Under what conditions can we expect good benthic discrimination – what are the no-go conditions?
- Which benthic types are difficult to discriminate?
- What is the minimum fraction of live coral detectable under various water column conditions?

**Answer these questions by examining errors related to unmixing, water conditions, inversion modeling, and atmospheric effects.**

# Multiple Endmember Spectral Mixing Analysis (MESMA)

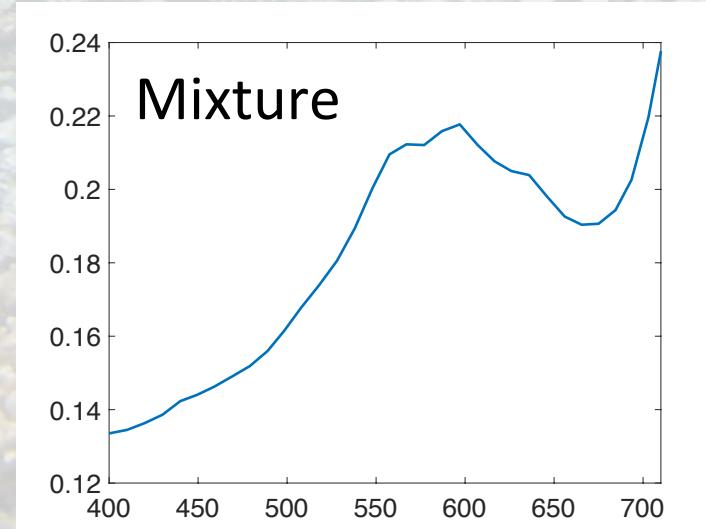


1/10 endmembers

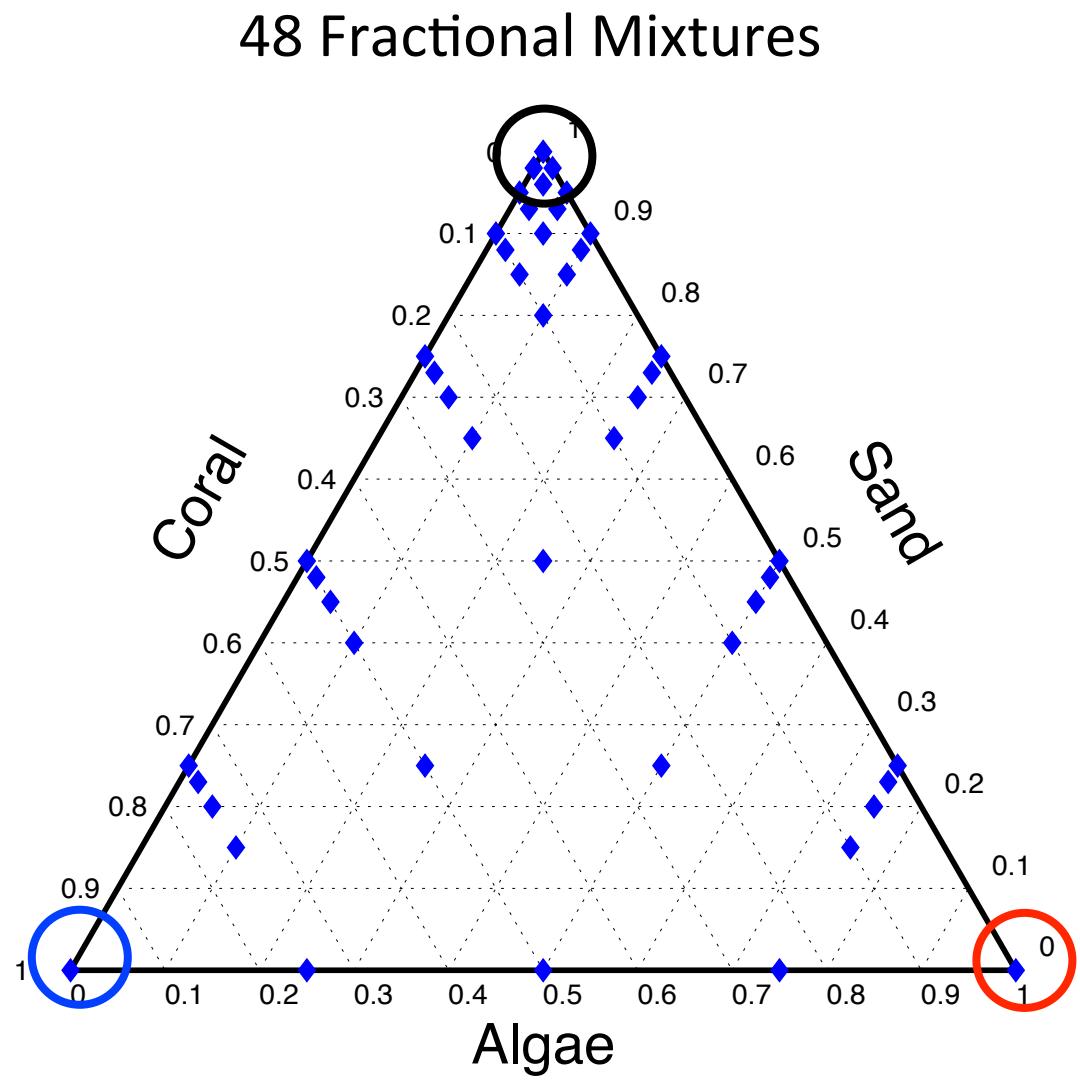
1/10 endmembers

1/10 endmembers

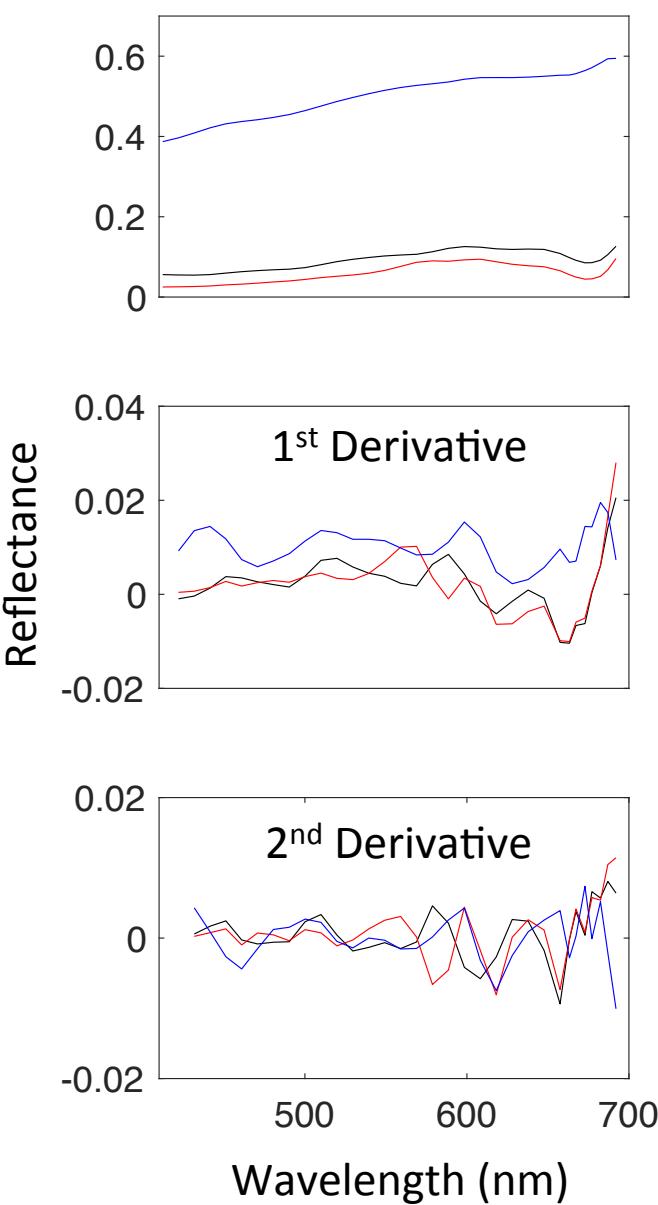
Each Mixture Modelled w/  
 $9^3$  (729) Endmember  
Combinations



**Mixtures including:**  
Live Coral  
Sand  
5 Algal Types  
(*Turf, Brown, Green, Red, CCA*)



## Spectral Derivatives

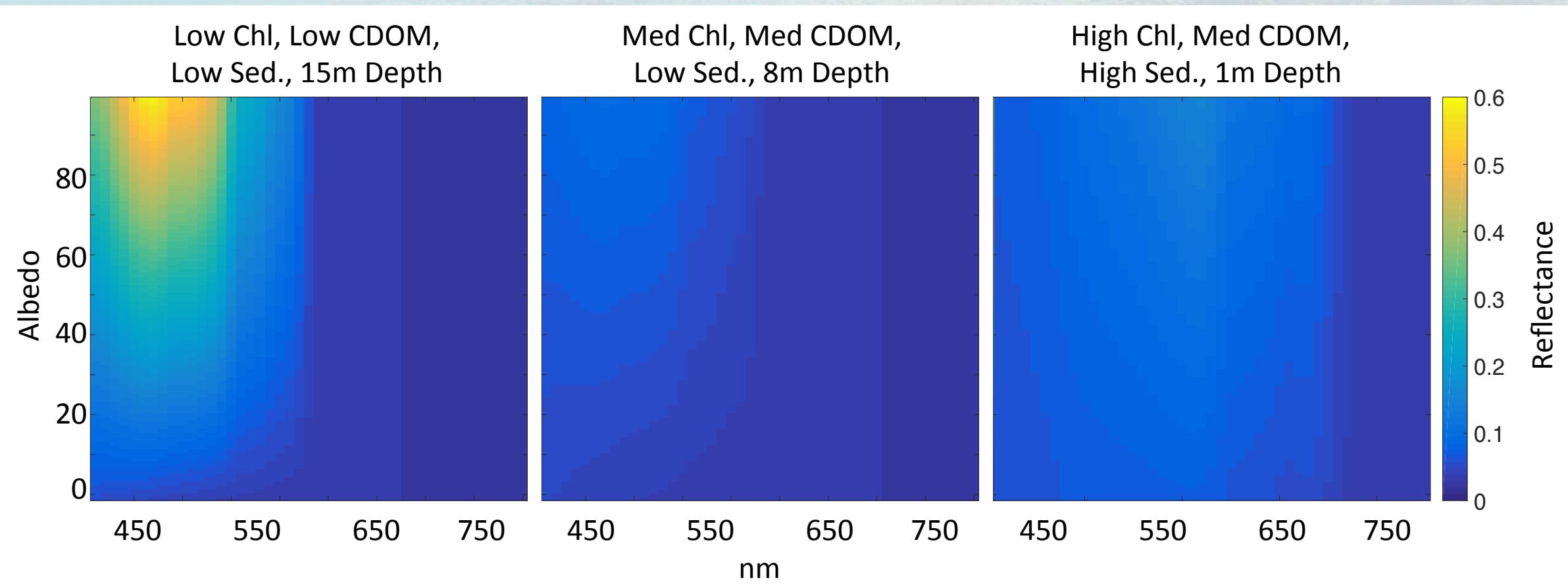


# Error Due to MESMA Unmixing



# Changes in Reflectance Due to Water Properties

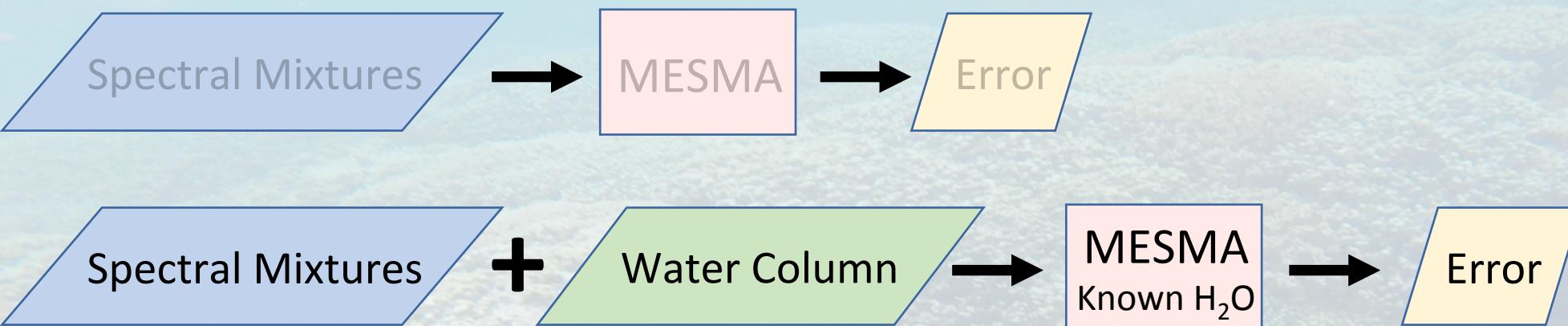
7000 Water Columns



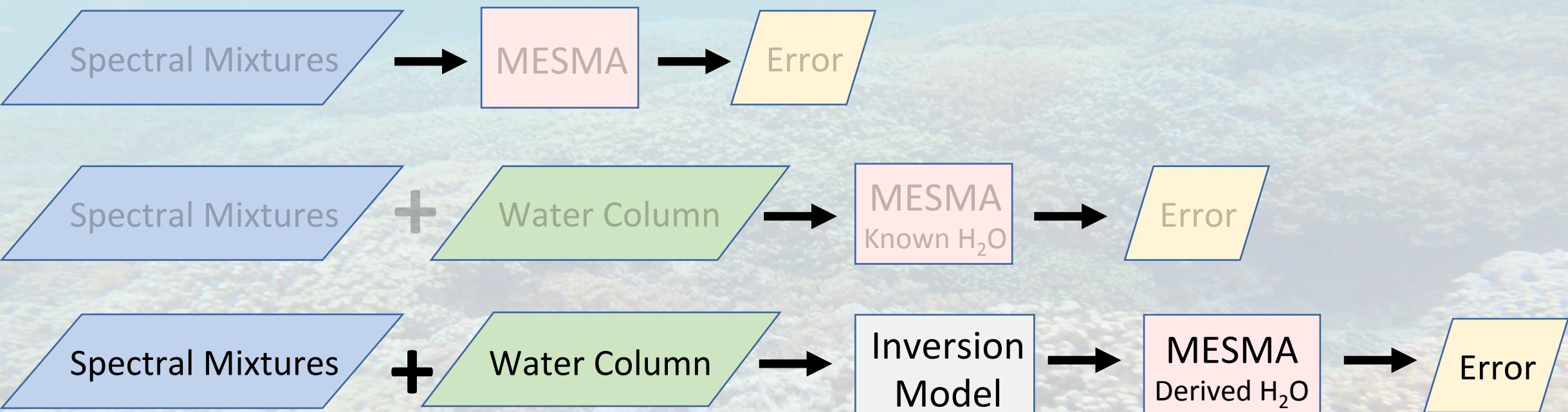
# Realistic Range of Environmental Factors

Variable	Values for Simulation
Depth (m)	1, 2, 3, 5, 8, 10, 15
Wind Speed ( $\text{m s}^{-1}$ )	0, 1, 2, 5, 10
CDOM ( $\text{m}^{-1}$ )	0.01, 0.02, 0.05, 0.1, 0.5
Chlorophyll concentration ( $\text{mg m}^{-3}$ )	0, 0.1, 0.25, 0.5, 1
Suspended carbonate sediment ( $\text{g m}^{-3}$ )	0, 0.1, 0.2, 0.5, 1, 2, 5, 10

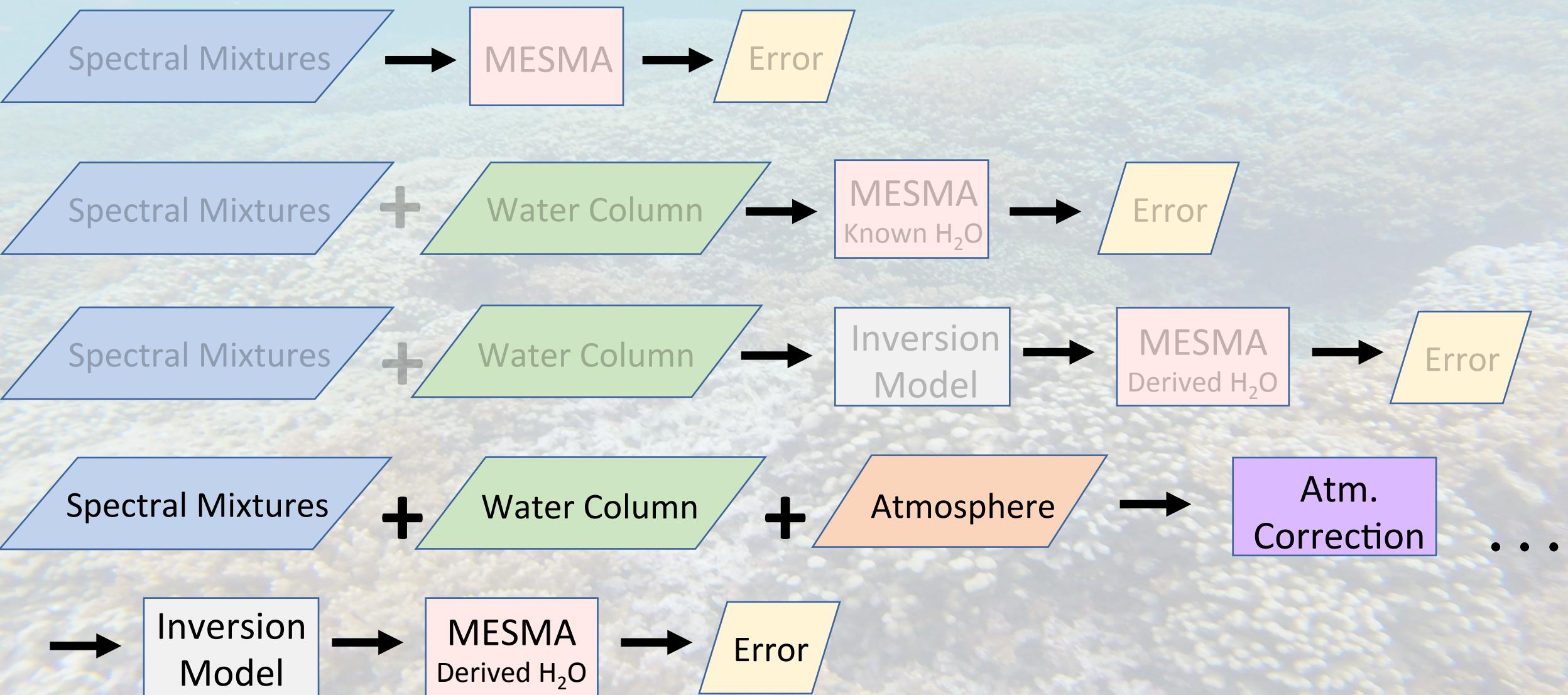
# Error Due to Water Column



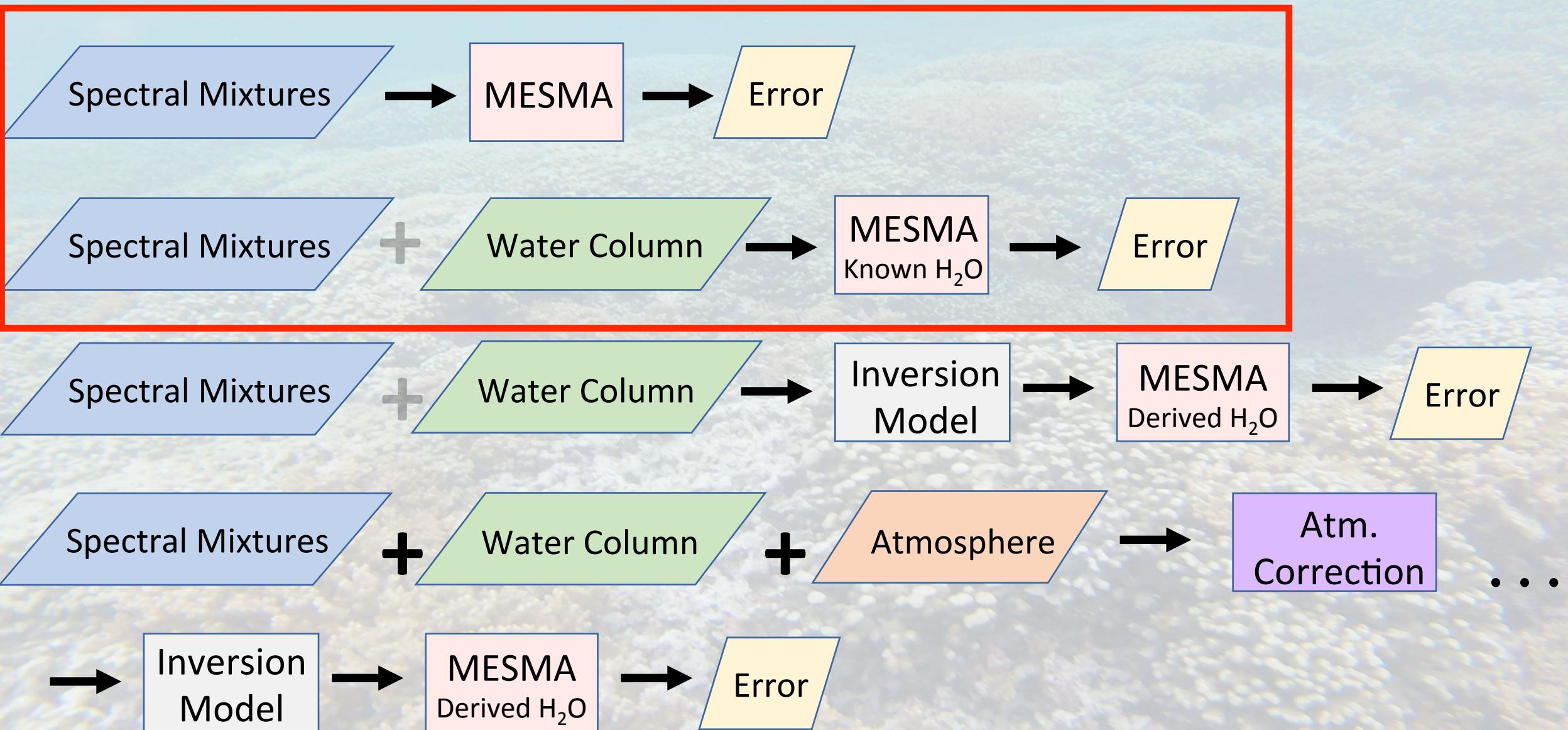
# Error Due to Inversion Model



# Error Due to Atmospheric Effects and Correction

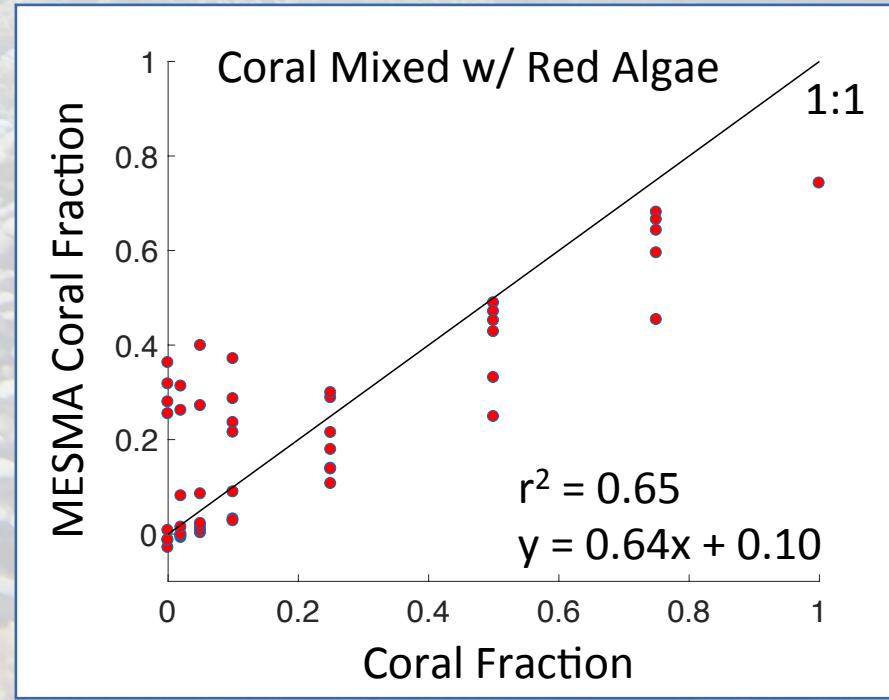
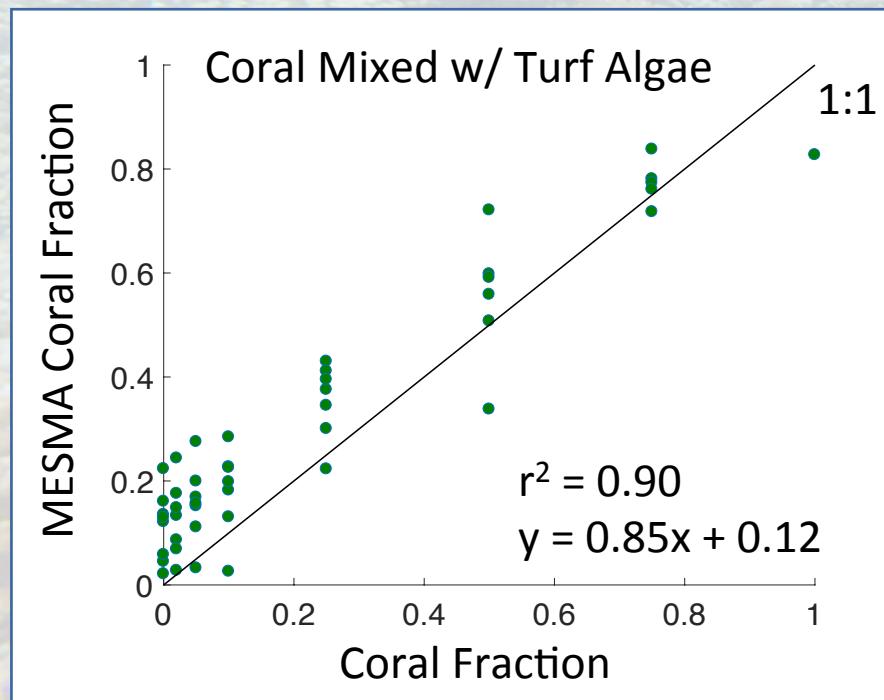


# Error Due to Atmospheric Effects and Correction

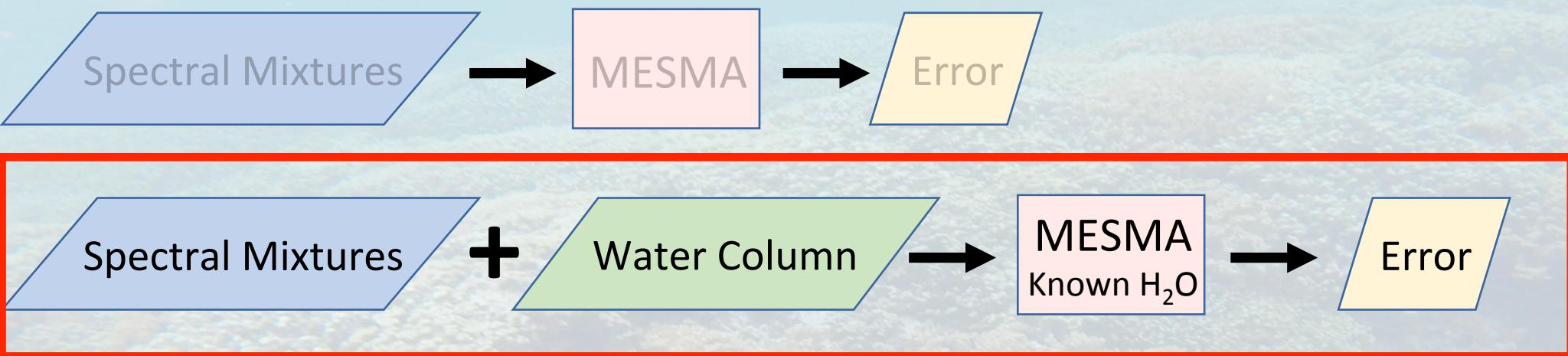


# Results of MESMA/Derivatives

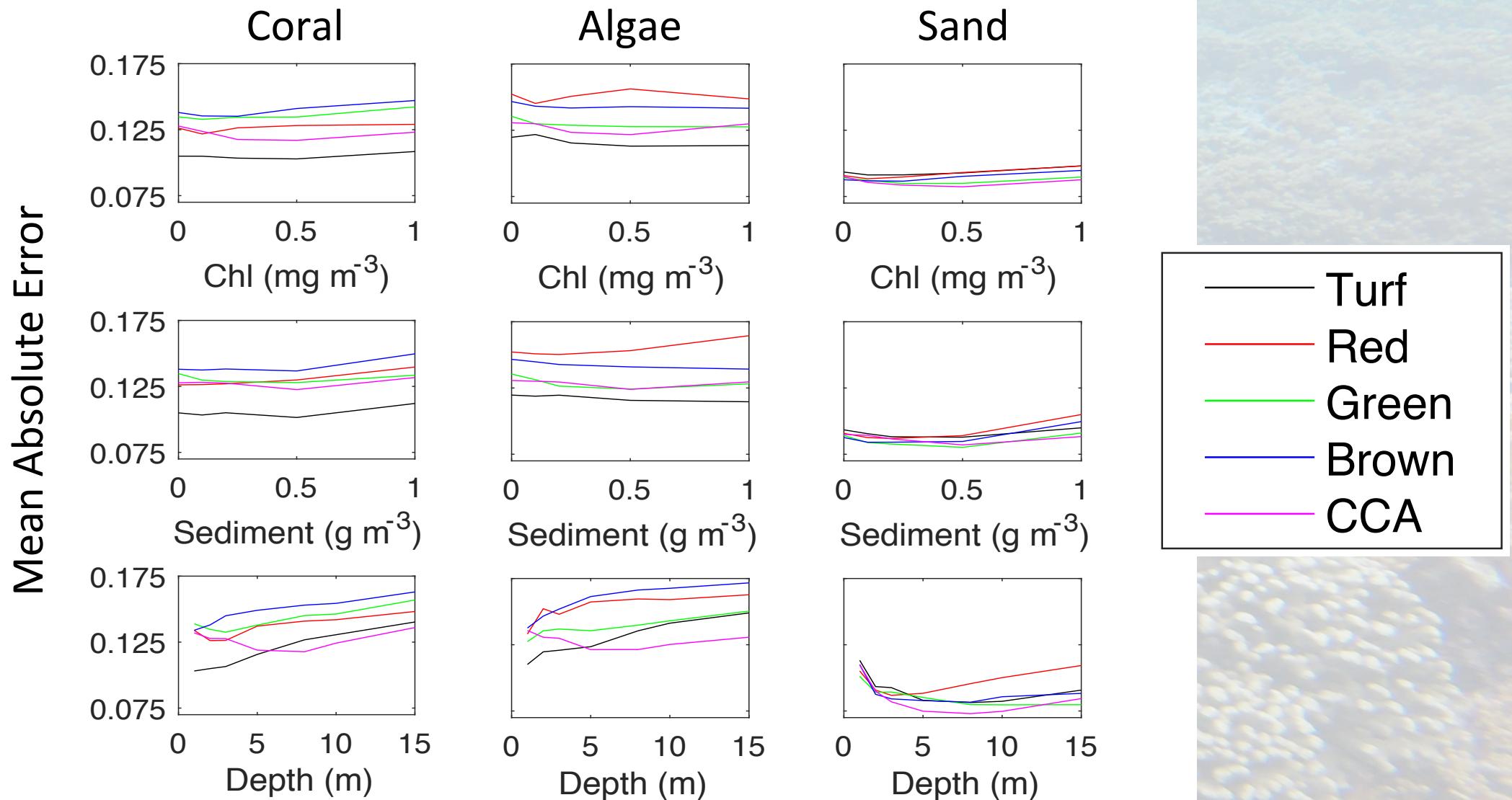
- Coral and algae are difficult to separate with MESMA, but not all algal types produce similar errors.
- Derivatives (1<sup>st</sup> & 2<sup>nd</sup>) of mixed spectra and endmembers produce better results.



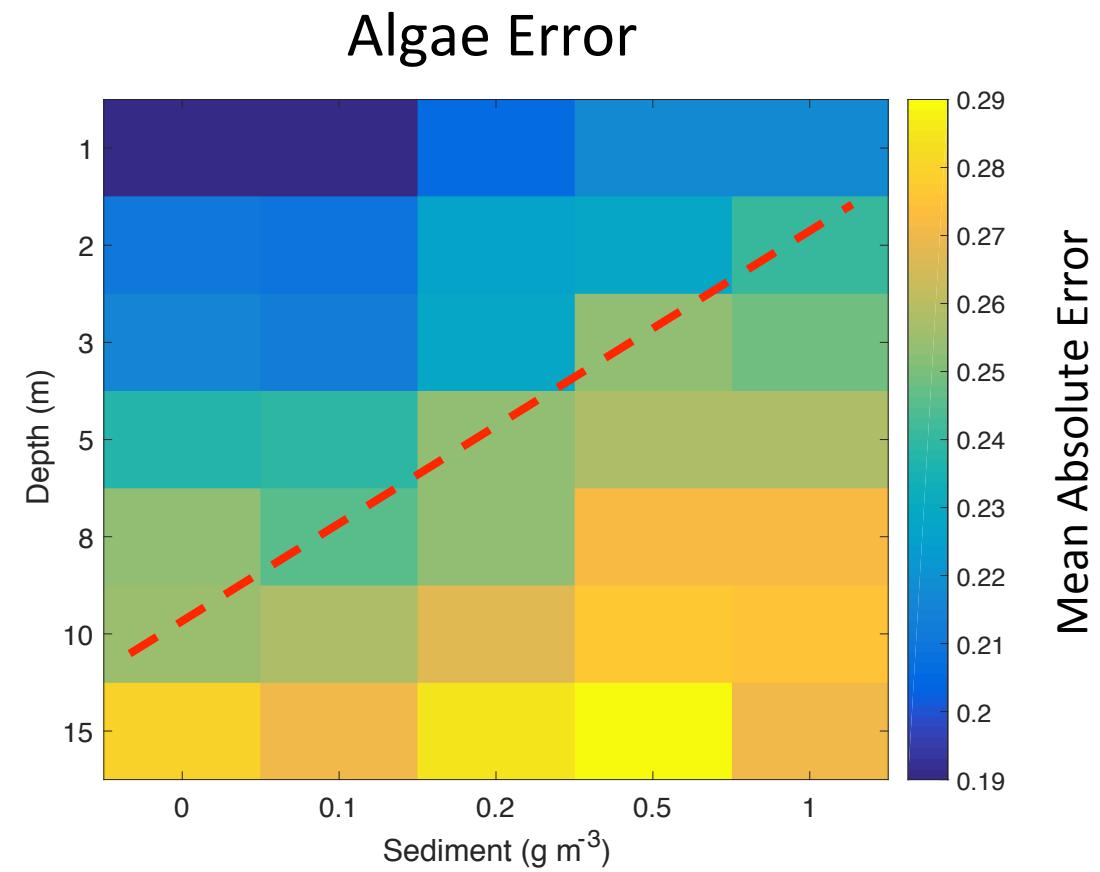
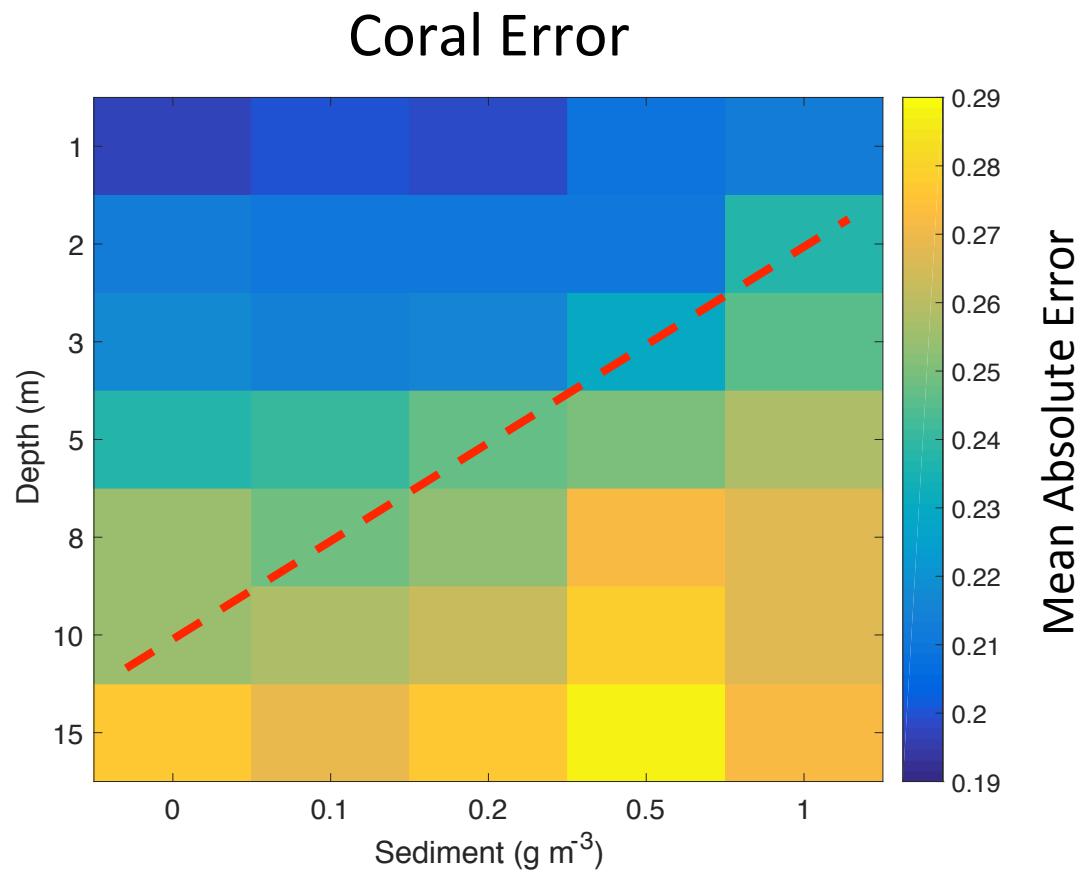
# Error Due to Water Column



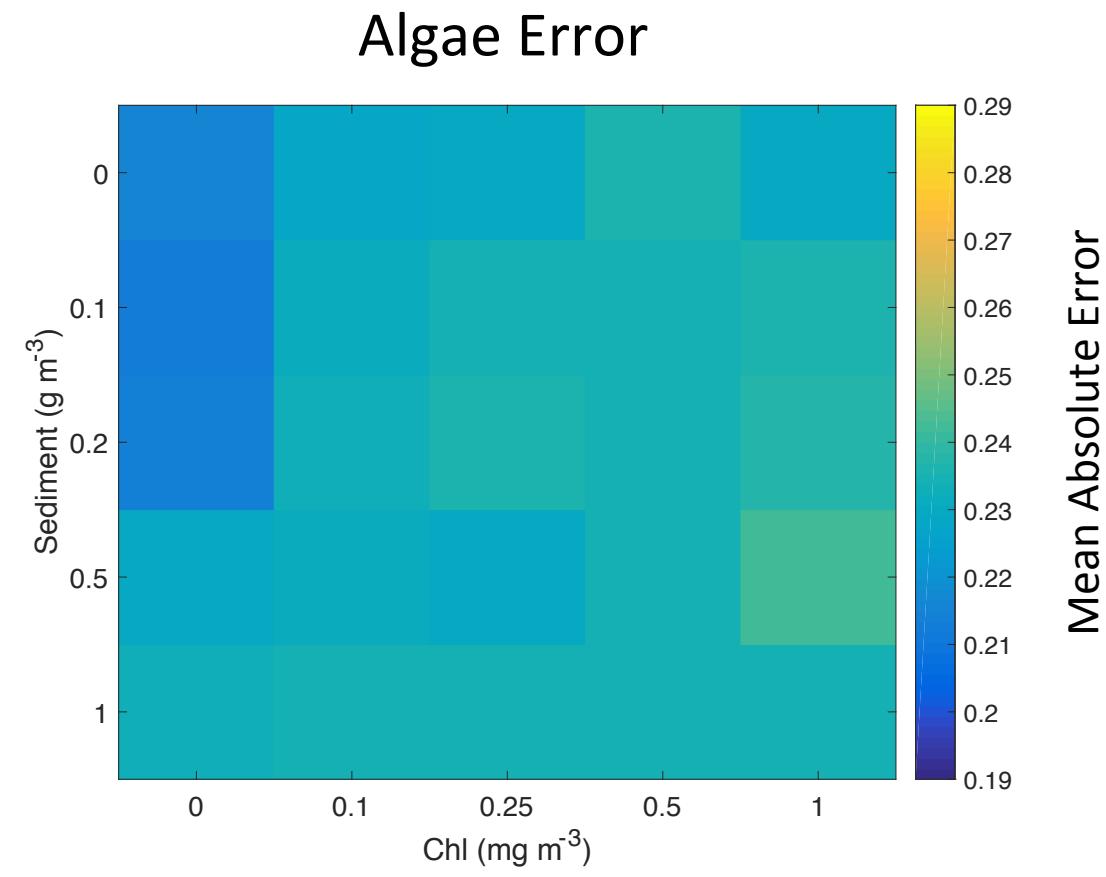
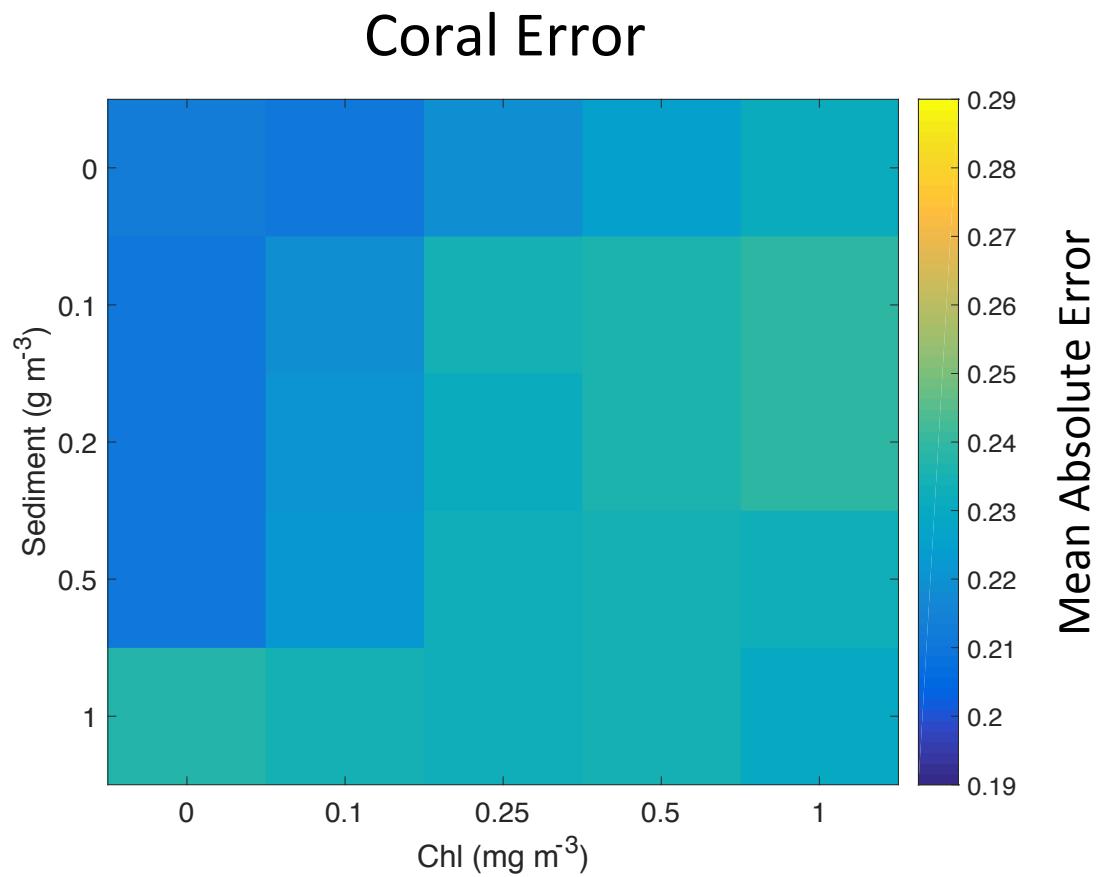
# Effect of Water Constituents on Error



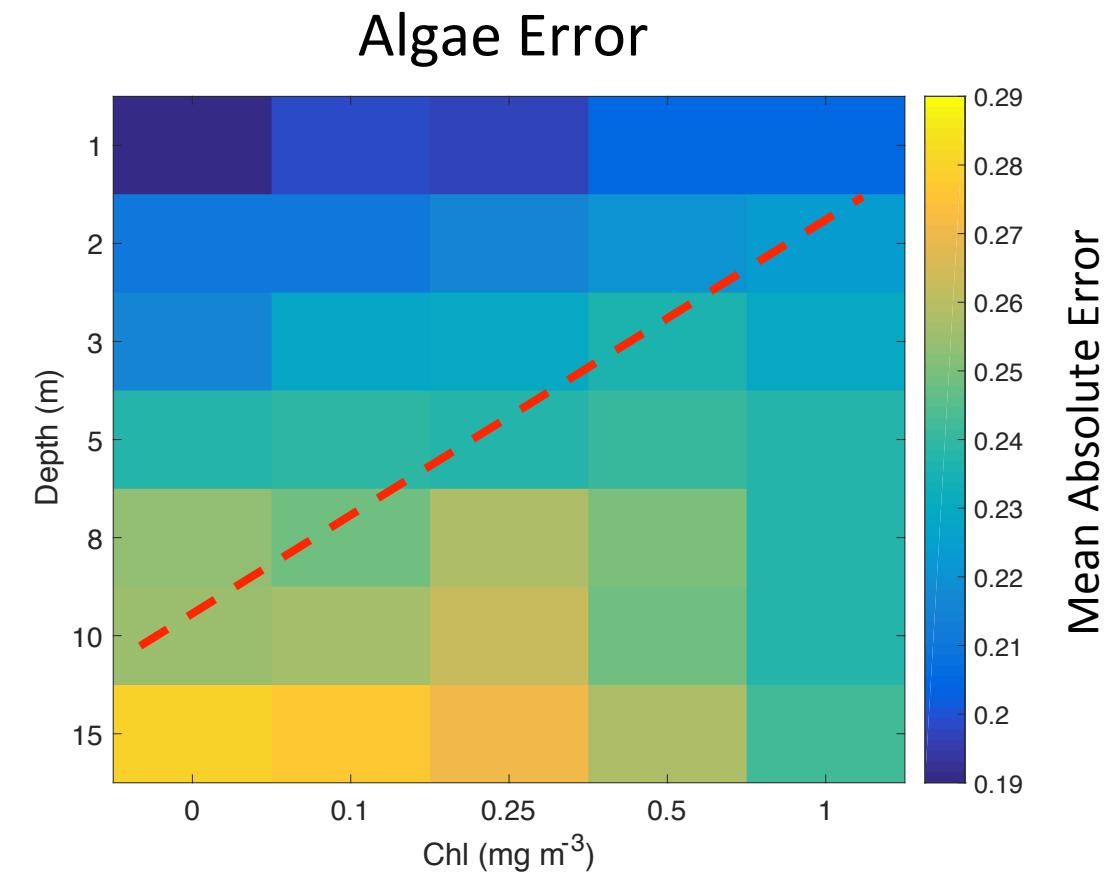
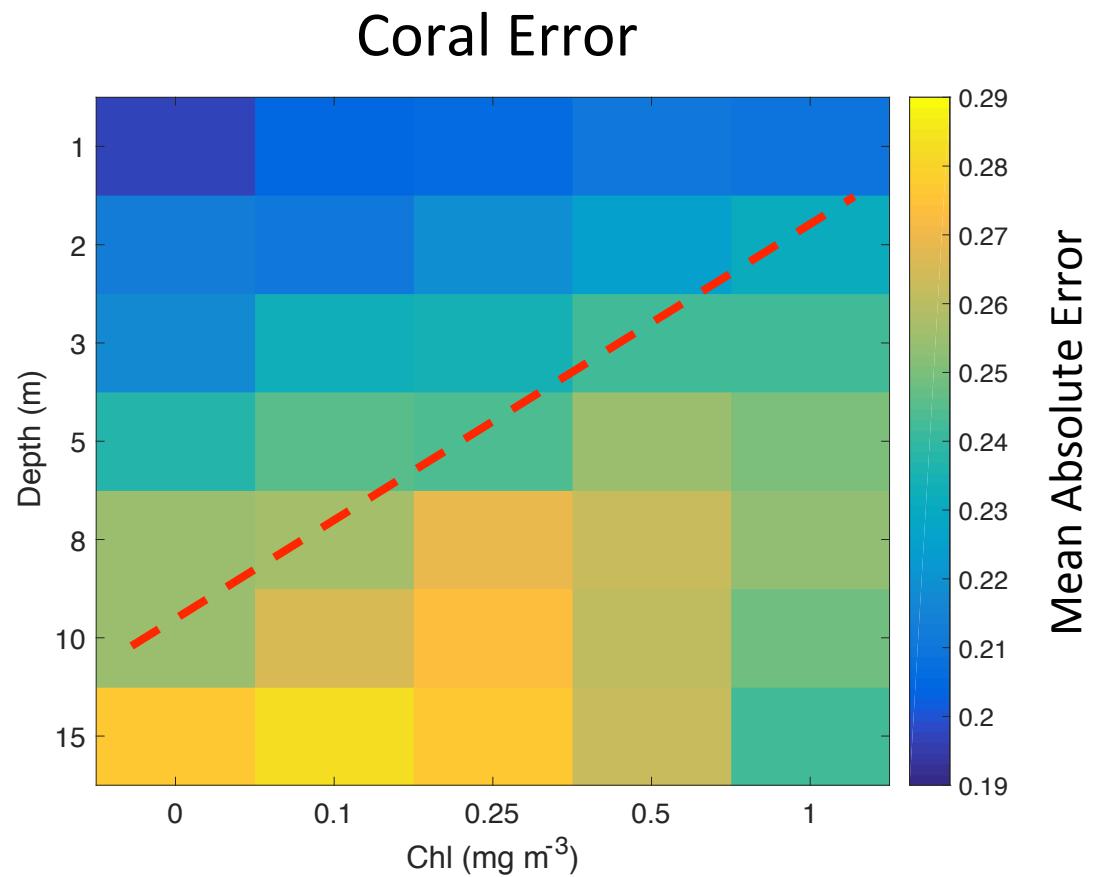
# Effect of Sediment and Depth on Error



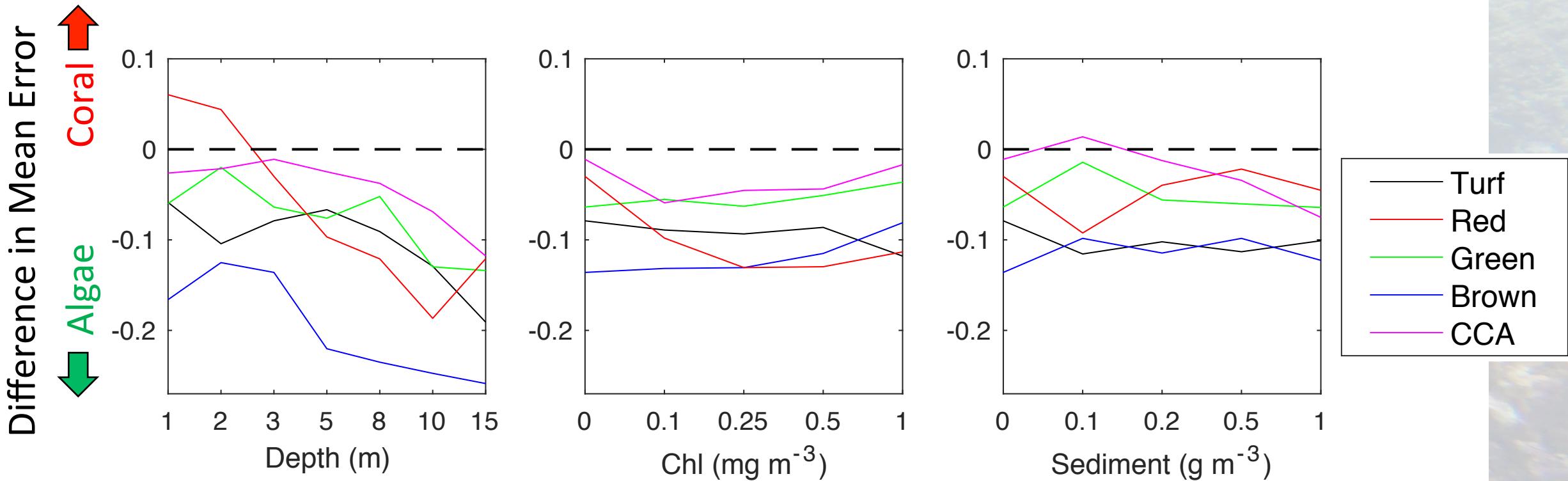
# Effect of Chlorophyll and Sediment on Error



# Effect of Chlorophyll and Depth on Error

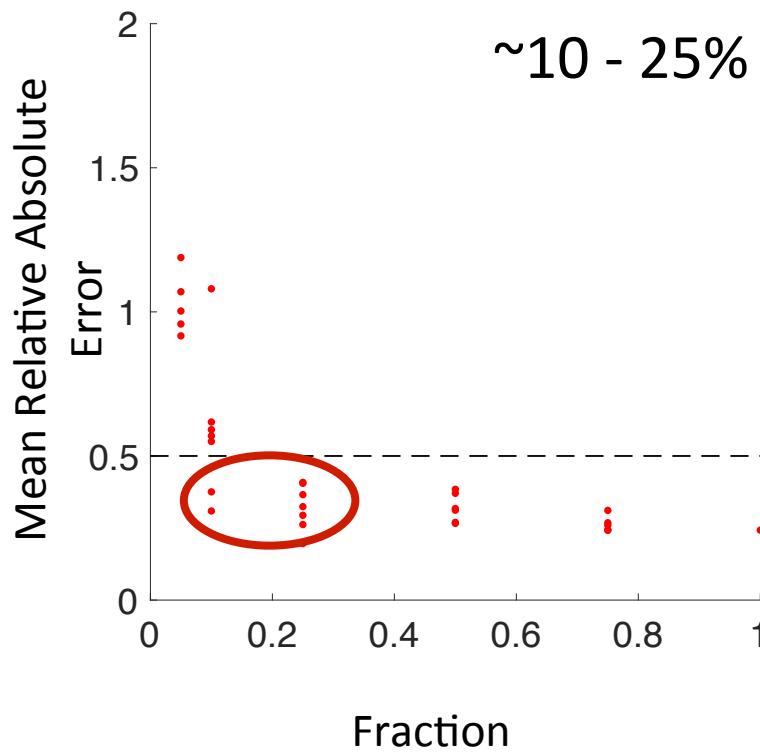


# Confusion between Coral and Algal Types

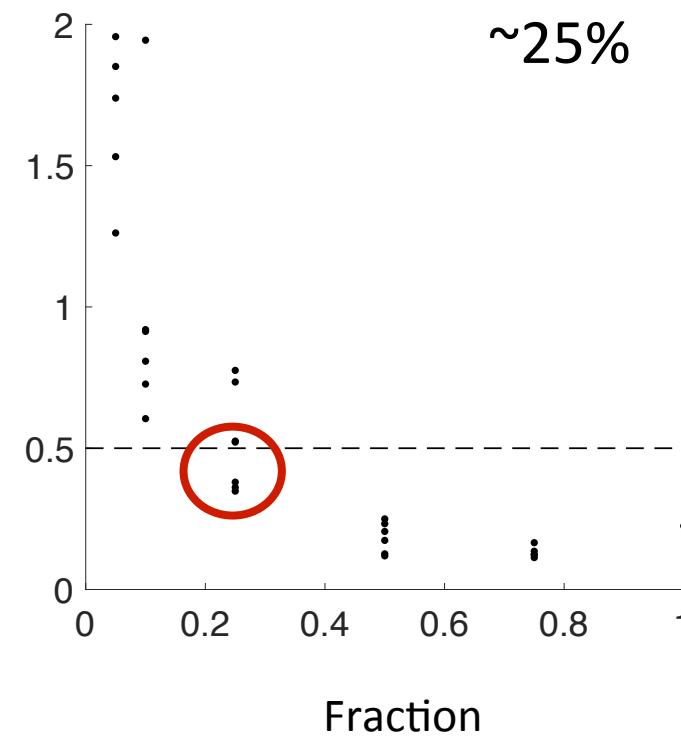


# Minimum Benthic Fraction Thresholds

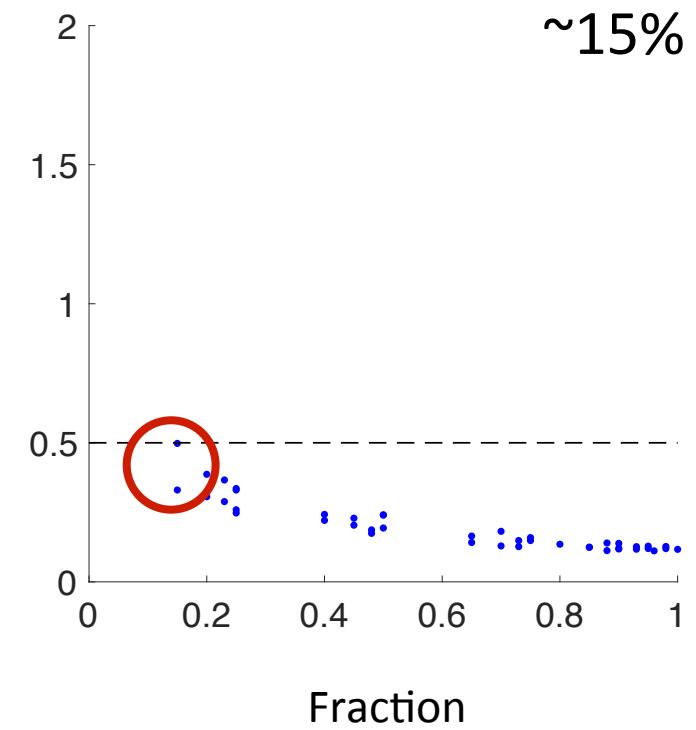
Coral



Turf Algae



Sand



Depth = 3 m, clear water

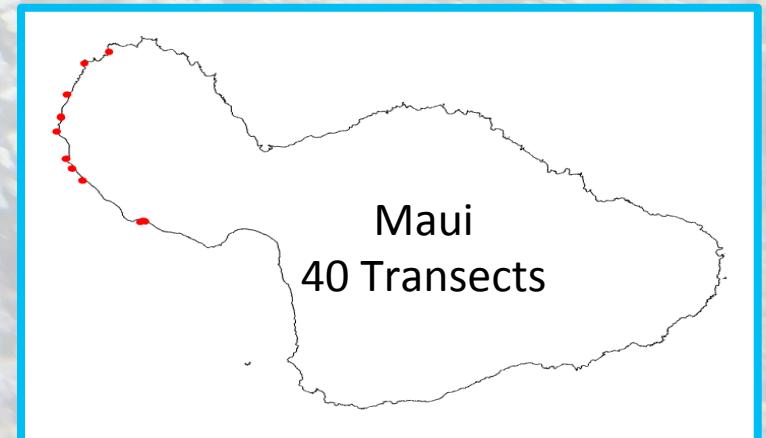
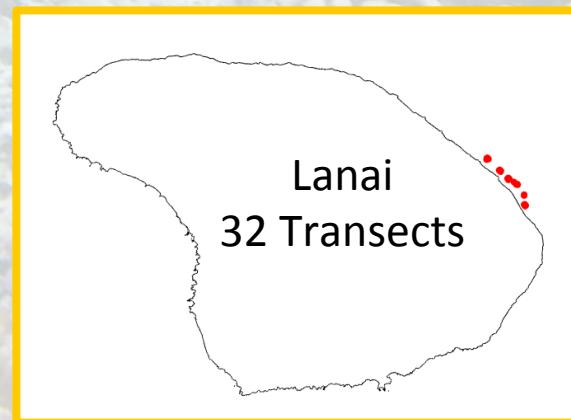
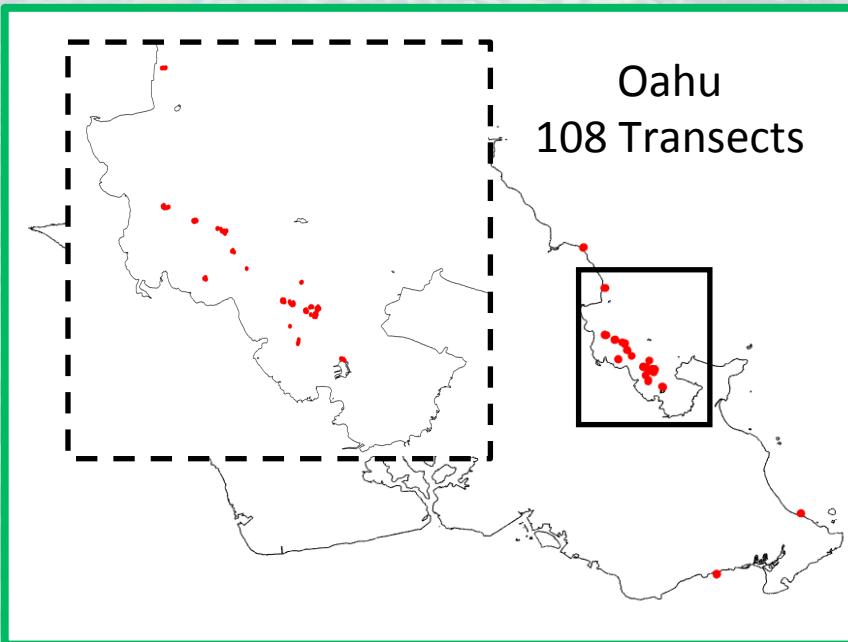
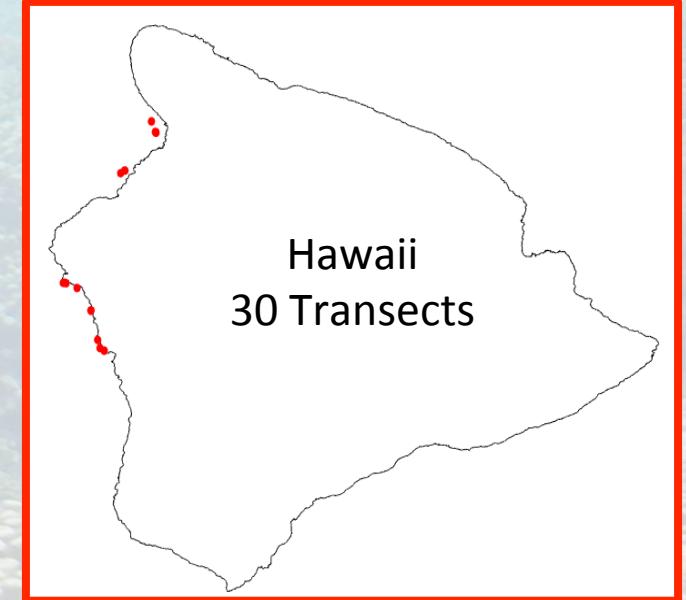
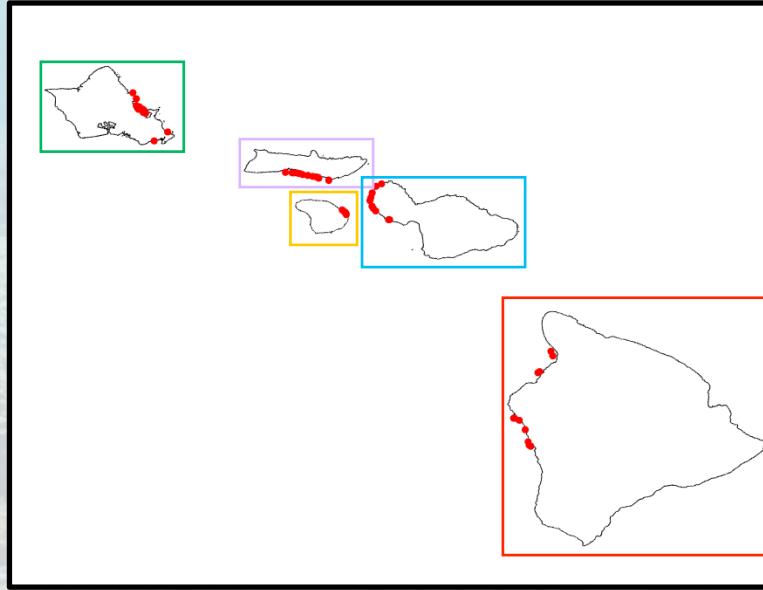
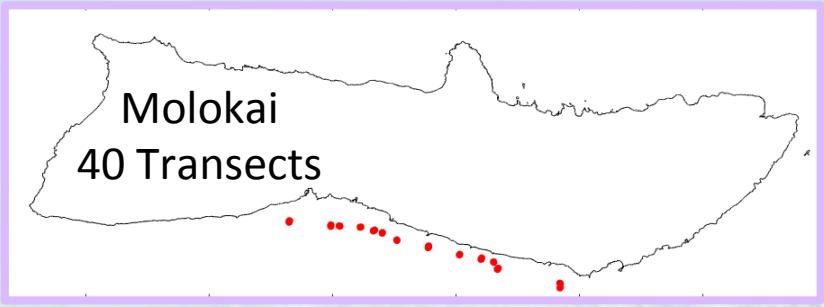
# Conclusions so far...

- Deep water areas consistently have the most error, but this is modulated by suspended sediment and chlorophyll concentration. No go conditions will be dependent on the level of acceptable error.
- Coral cover is consistently confused as algal cover, and this effect increases with depth. Brown algae leads to the most confusion.
- At a relative absolute error level of 0.5, there will need to be around 25% of coral or algae fraction, and 15% sand fraction for acceptable discrimination.

# Ongoing work...

- Water column inversion & atmospheric effects will help refine no go conditions
- Use MESMA to detect the correct **algal type** in a mixed pixel
- Validation of optimized unmixing algorithm with in water photomosaics

# 250 Phototransects Across 5 Hawaiian Islands



# Phototransect Collection (250)

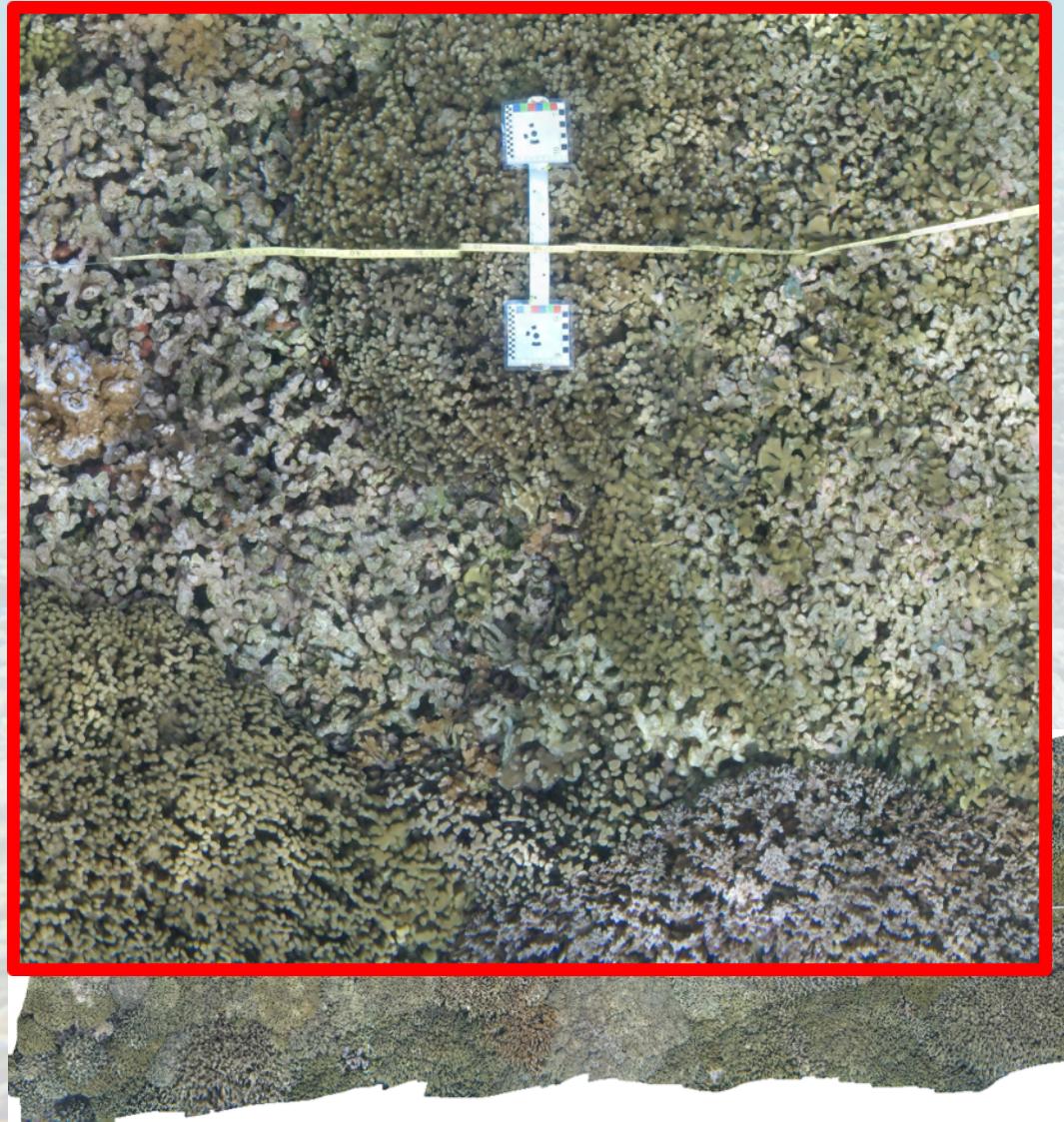
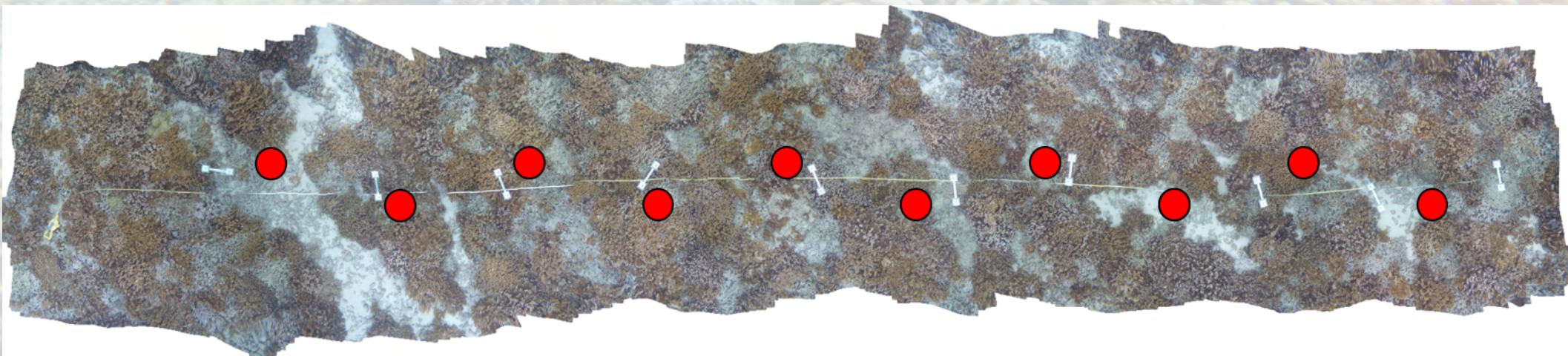
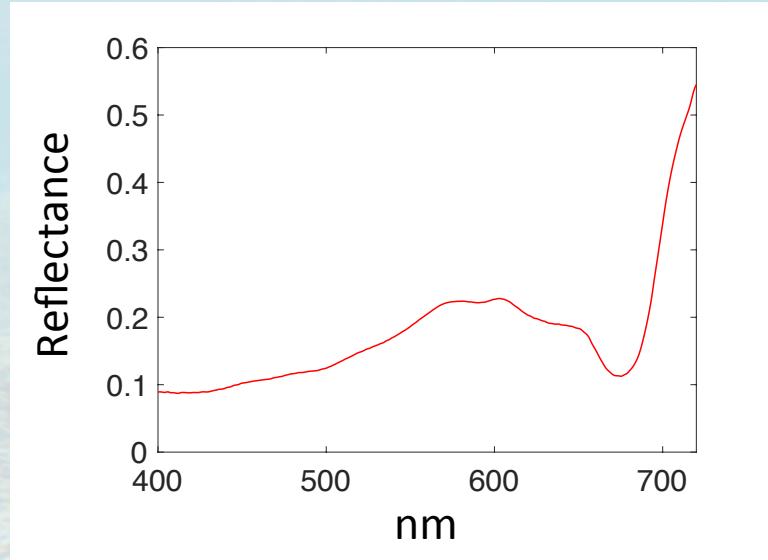


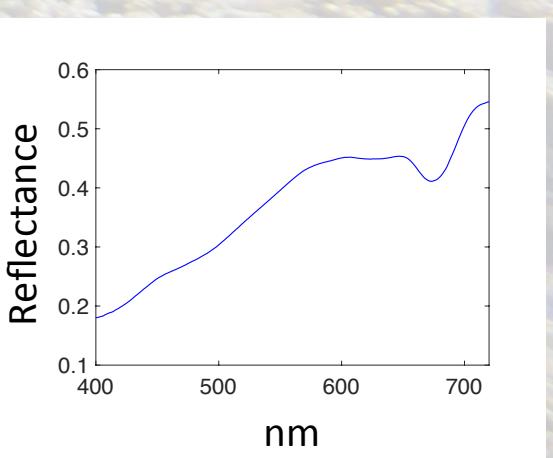
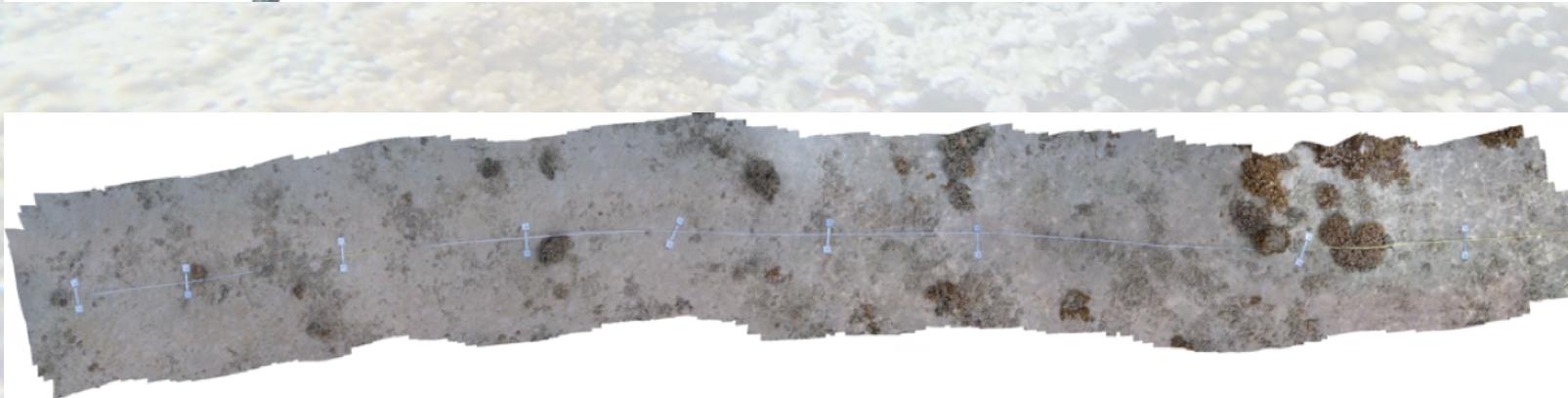
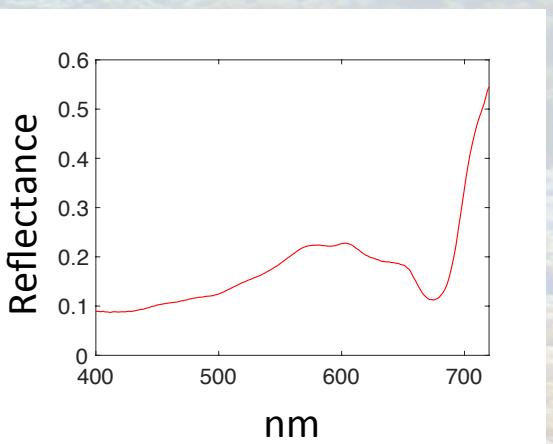
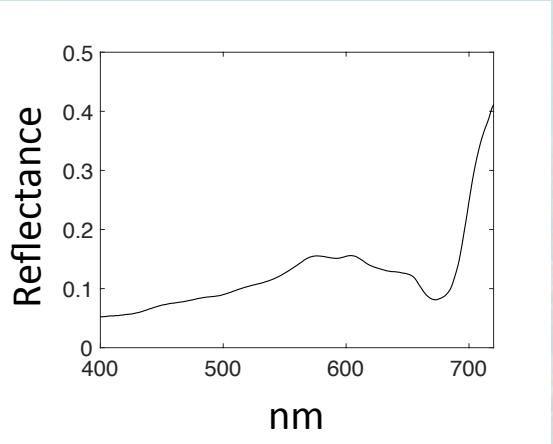
Photo: Juan Torres-Perez



# Spectral Transects (56/250)



# Phototransects w/ Spectra



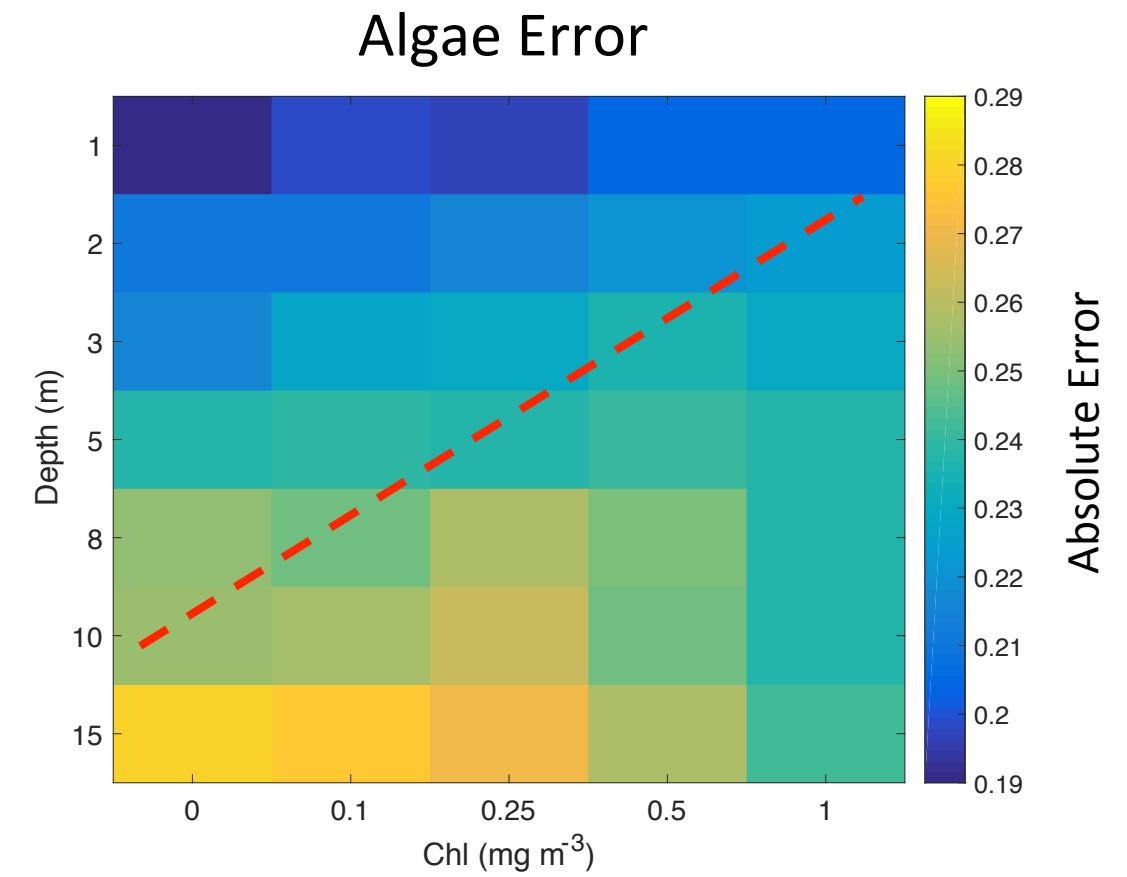
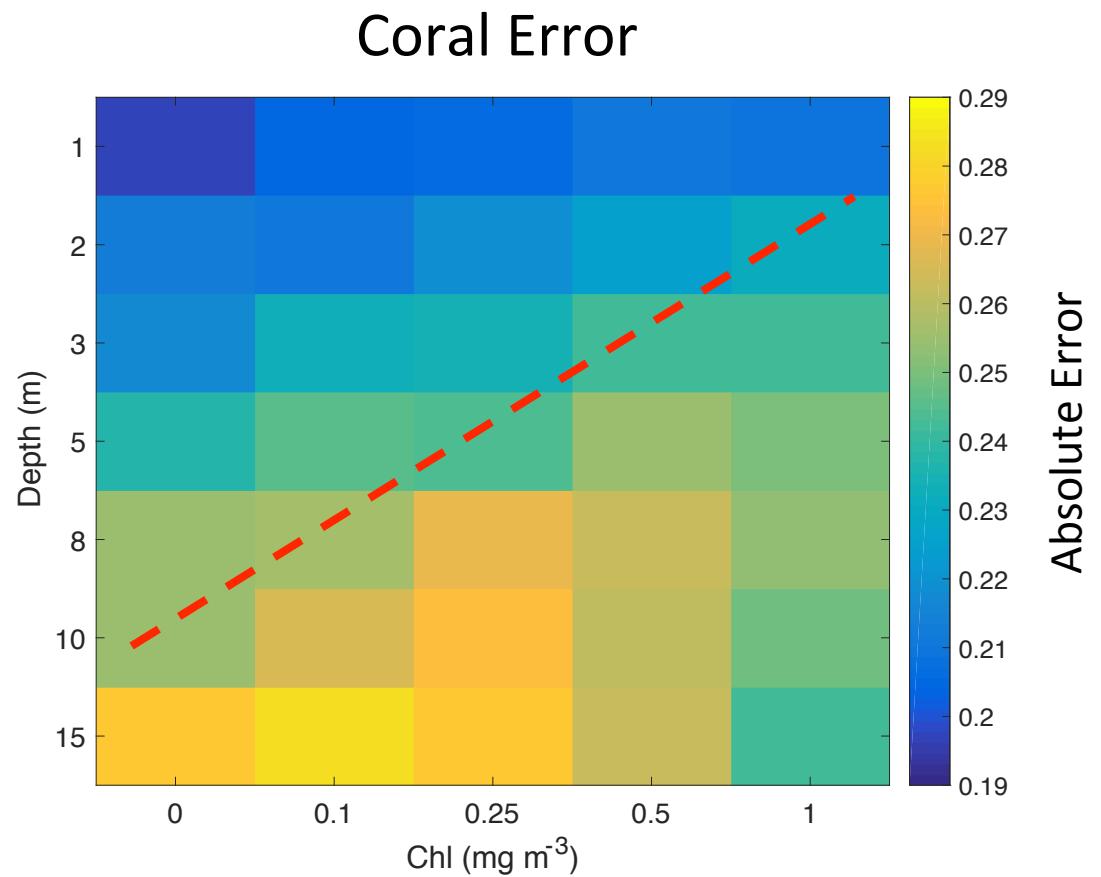
# Questions?

Tom Bell  
[tbell@ucsb.edu](mailto:tbell@ucsb.edu)

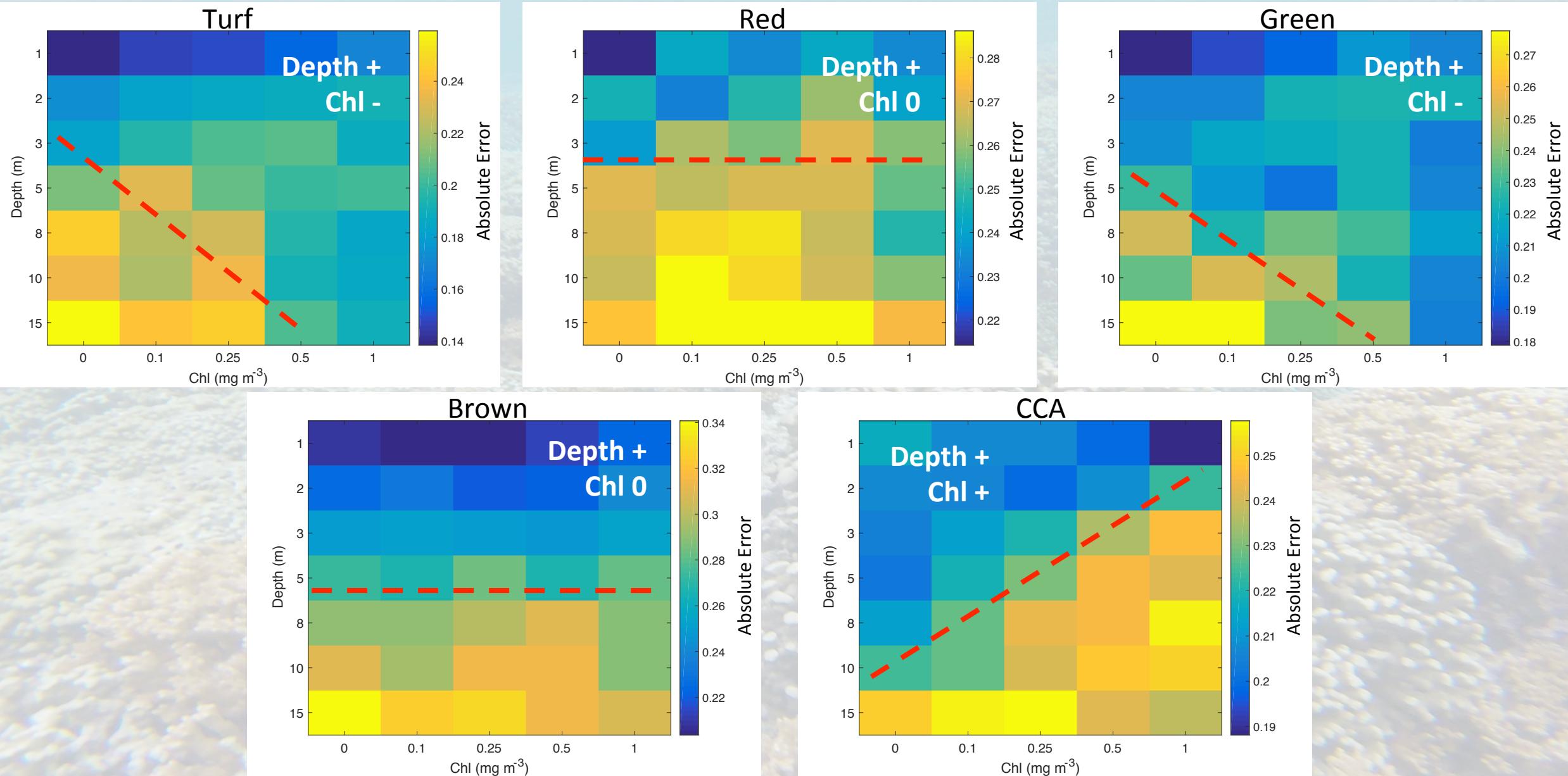
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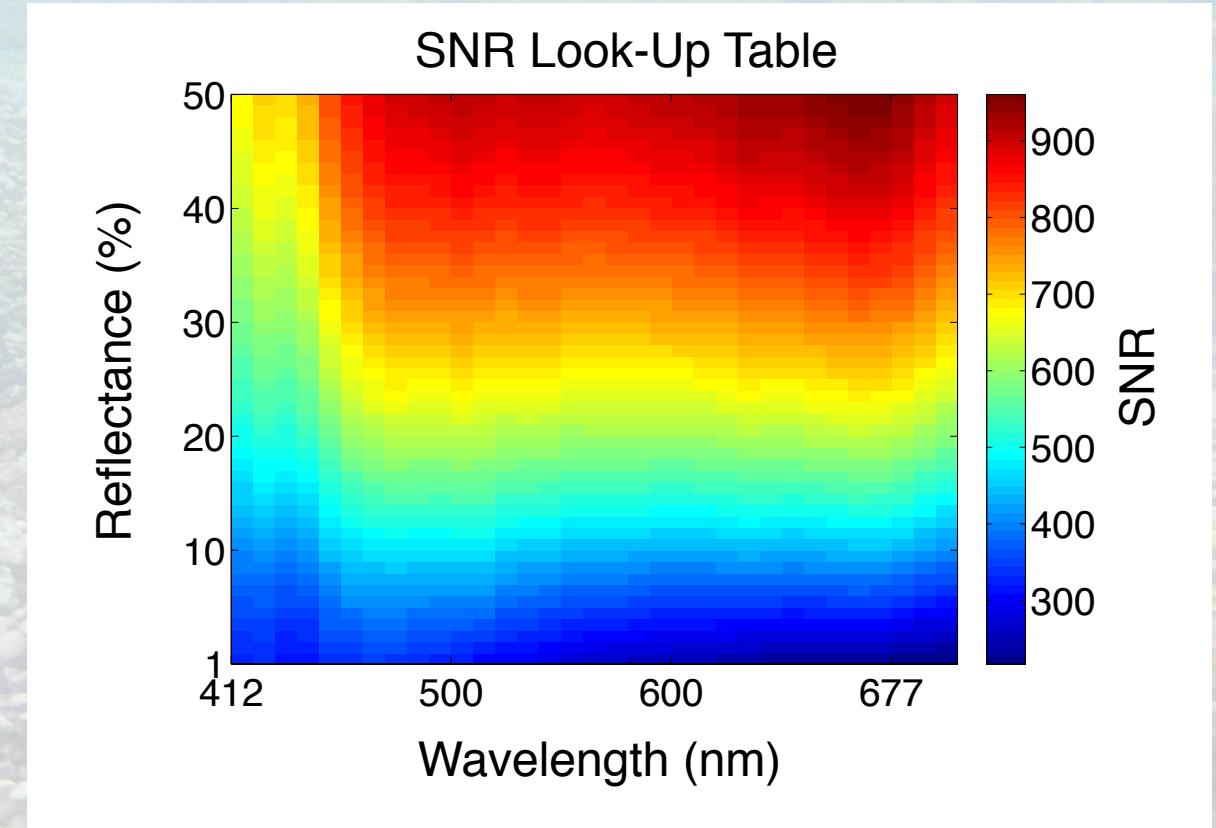
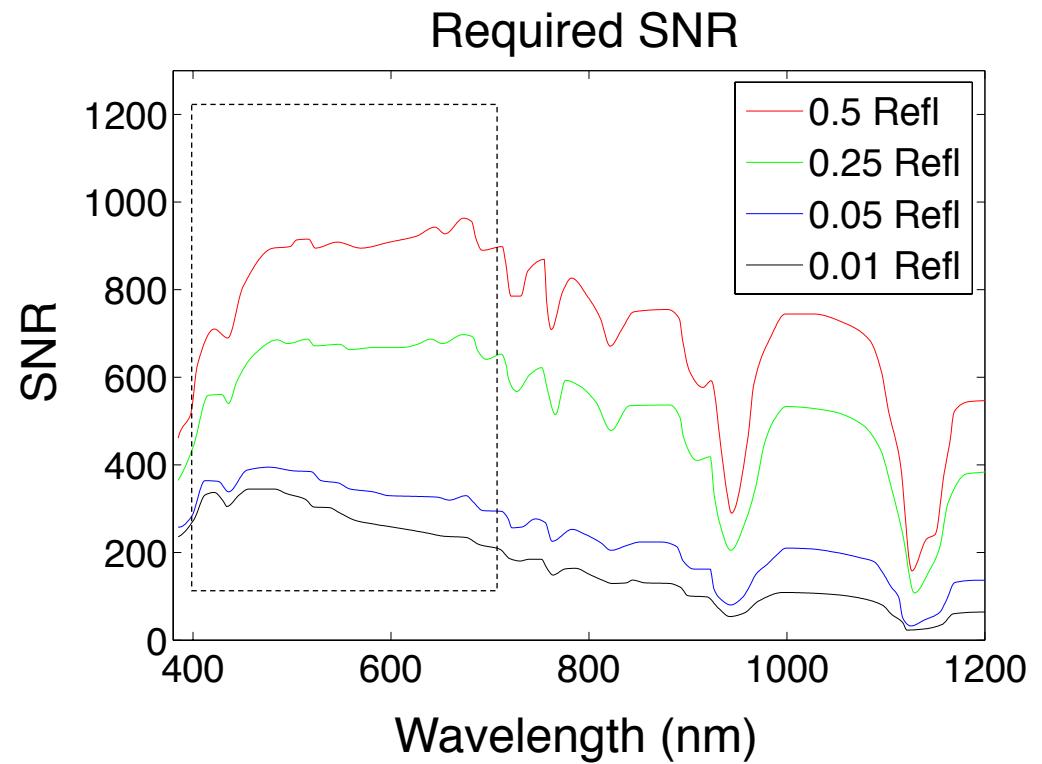
# Effect of Chlorophyll and Depth on Error



# Effect of Different Algal Types on Error



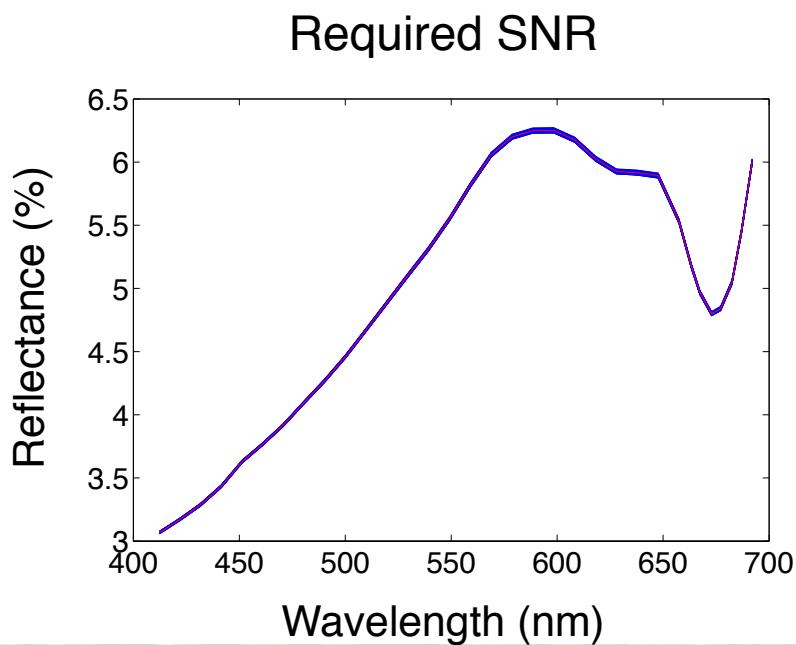
# Examine effect of noise on unmixing



JPL 2015

# Required SNR has negligible effect on unmixing

$$\text{Refl}_{\text{Noisy}} = \text{Refl}(1 + 0.5 N(0,1) / \text{SNR})$$



	Brown	Red	Green	Turf	CCA
Brown Coral	Coral: $4 \times 10^{-4}$	$7 \times 10^{-4}$	$3 \times 10^{-4}$	$4 \times 10^{-4}$	$5 \times 10^{-4}$
	Bleached: $7 \times 10^{-4}$	$7 \times 10^{-4}$	$7 \times 10^{-4}$	$7 \times 10^{-4}$	$7 \times 10^{-4}$
	Algae: $9 \times 10^{-4}$	$7 \times 10^{-4}$	$8 \times 10^{-4}$	$6 \times 10^{-4}$	$5 \times 10^{-4}$
	Sand: $5 \times 10^{-4}$	$5 \times 10^{-4}$	$6 \times 10^{-4}$	$6 \times 10^{-4}$	$6 \times 10^{-4}$
	Shade: $1 \times 10^{-3}$	$1 \times 10^{-3}$	$1 \times 10^{-3}$	$1 \times 10^{-3}$	$1 \times 10^{-3}$
Blue Coral	Coral: $6 \times 10^{-4}$	$6 \times 10^{-4}$	$4 \times 10^{-4}$	$7 \times 10^{-4}$	$6 \times 10^{-4}$
	Bleached: $8 \times 10^{-4}$	$8 \times 10^{-4}$	$8 \times 10^{-4}$	$8 \times 10^{-4}$	$8 \times 10^{-4}$
	Algae: $1 \times 10^{-3}$	$5 \times 10^{-4}$	$9 \times 10^{-4}$	$1 \times 10^{-3}$	$1 \times 10^{-3}$
	Sand: $6 \times 10^{-4}$	$6 \times 10^{-4}$	$6 \times 10^{-4}$	$7 \times 10^{-4}$	$7 \times 10^{-4}$
	Shade: $1 \times 10^{-3}$	$3 \times 10^{-3}$	$1 \times 10^{-3}$	$1 \times 10^{-3}$	$1 \times 10^{-3}$
Soft Coral	Coral: $3 \times 10^{-4}$	$5 \times 10^{-4}$	$2 \times 10^{-4}$	$3 \times 10^{-4}$	$4 \times 10^{-4}$
	Bleached: $7 \times 10^{-4}$	$8 \times 10^{-4}$	$7 \times 10^{-4}$	$8 \times 10^{-4}$	$7 \times 10^{-4}$
	Algae: $1 \times 10^{-3}$	$9 \times 10^{-4}$	$9 \times 10^{-4}$	$6 \times 10^{-4}$	$5 \times 10^{-4}$
	Sand: $5 \times 10^{-4}$	$5 \times 10^{-4}$	$6 \times 10^{-4}$	$6 \times 10^{-4}$	$6 \times 10^{-4}$
	Shade: $1 \times 10^{-3}$	$8 \times 10^{-4}$	$1 \times 10^{-3}$	$1 \times 10^{-3}$	$1 \times 10^{-3}$

# How is this analysis unique and useful?

- Unmixing benthic fractions: MESMA and spectral derivative techniques
- Focus on AVIRIS/HyspIRI-like bands
- Full quantification of error related to:
  - spectral unmixing techniques
  - effects of a range of water constituents on error
  - error related to water inversion and atmospheric effects
- Examine different classes of algae