# On the Mutual Relation between SLAM and Image Enhancement in Underwater Environments

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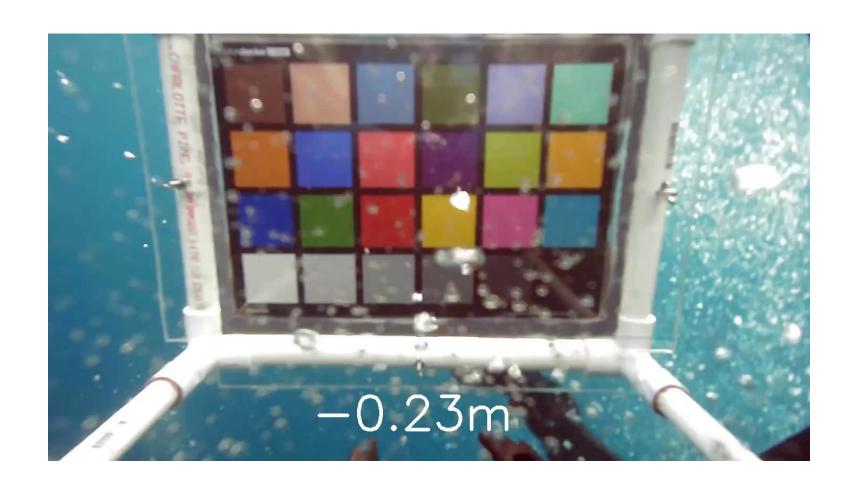


#### Underwater Exploration

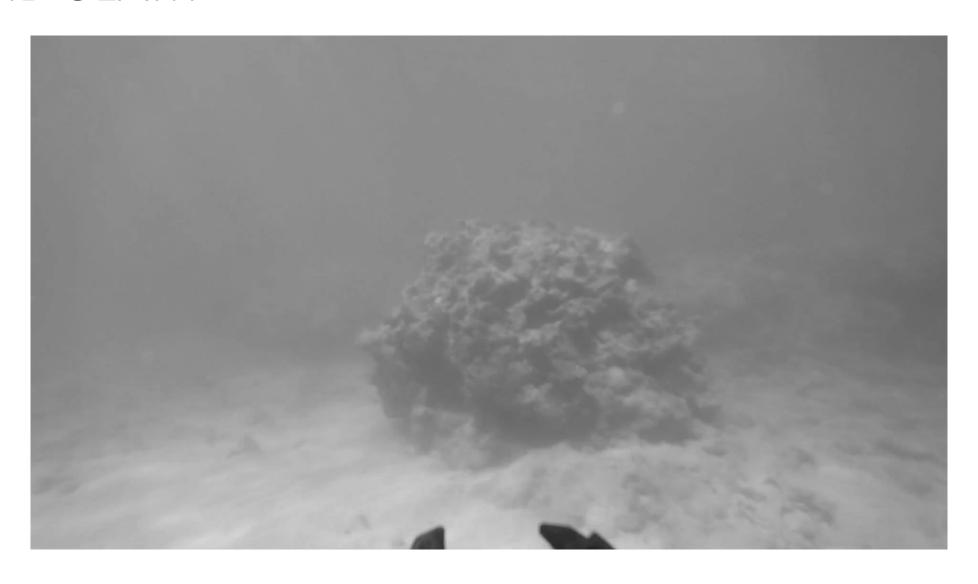


- Low-cost ROVs and AUVs
  - Monocular camera
  - Noisy, low-frequency IMU
- SLAM uncertainty
- Poor underwater perception

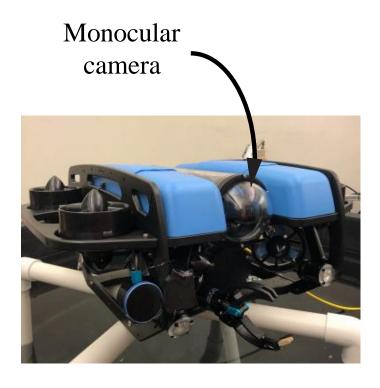
# Color Degradation Over Depth

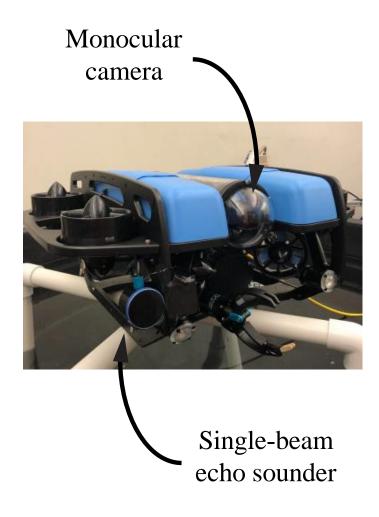


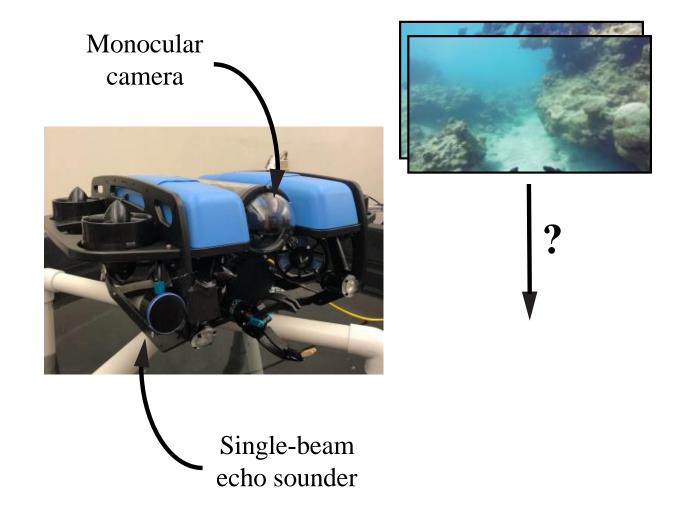
## ORB-SLAM

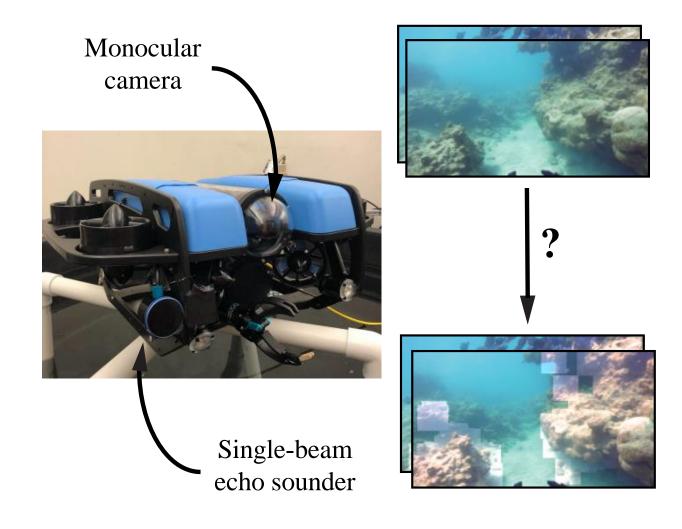




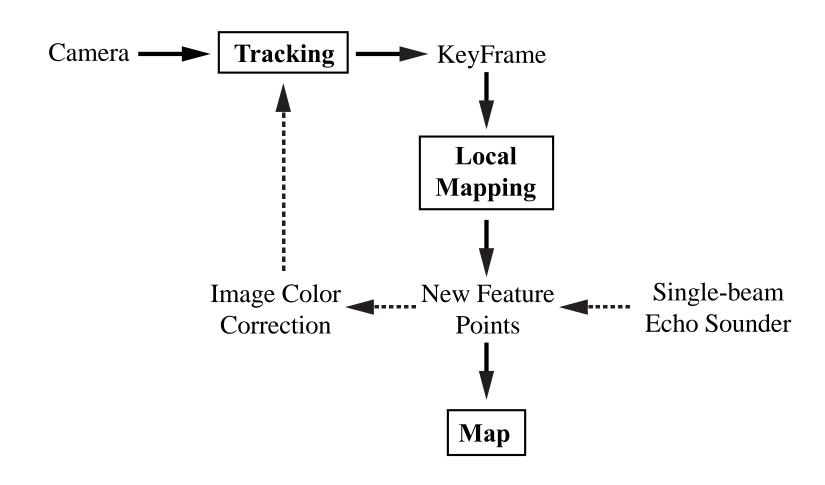








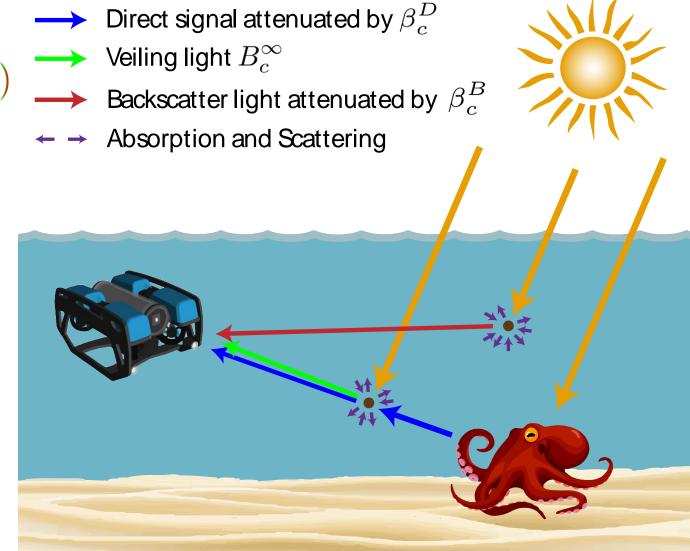
#### System Overview



# Revised Underwater Image Formation Model

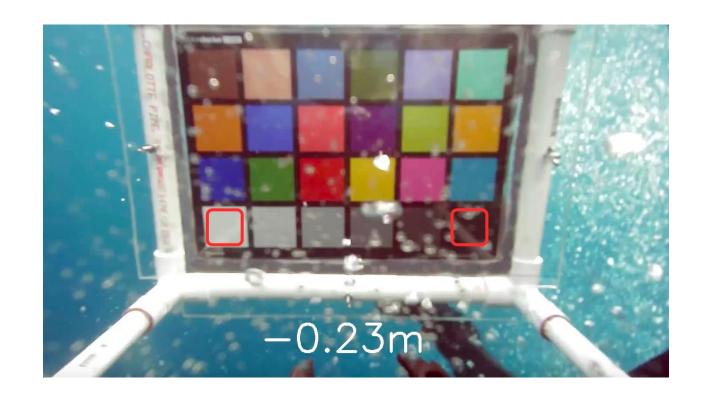
$$I_c = J_c \cdot e^{-\beta_c^D \cdot z} + B_c^{\infty} \cdot (1 - e^{-\beta_c^B \cdot z})$$

- Physics-based method
- Estimate veiling light
  - Average background color
- Estimate attenuation values



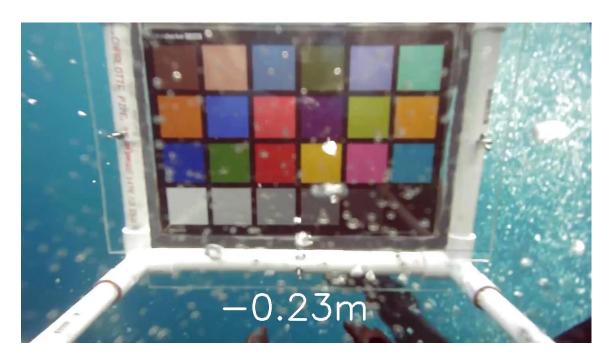
D. Akkaynak and T. Treibitz, "A revised underwater image formation model," in Proc. CVPR, 2018, pp. 6723–6732.

#### Estimating Attenuation Values



$$I_c = J_c e^{-\beta_c^D(\mathbf{v}_D)z} + B_c^\infty (1 - e^{-\beta_c^B(\mathbf{v}_B)z})$$

# Over Depth

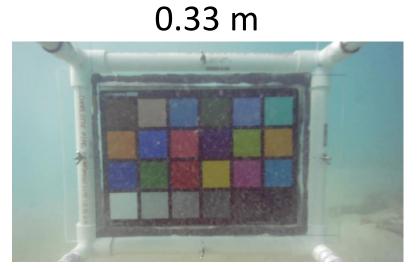




Raw Corrected

### Over Viewing Distance

Raw



Corrected

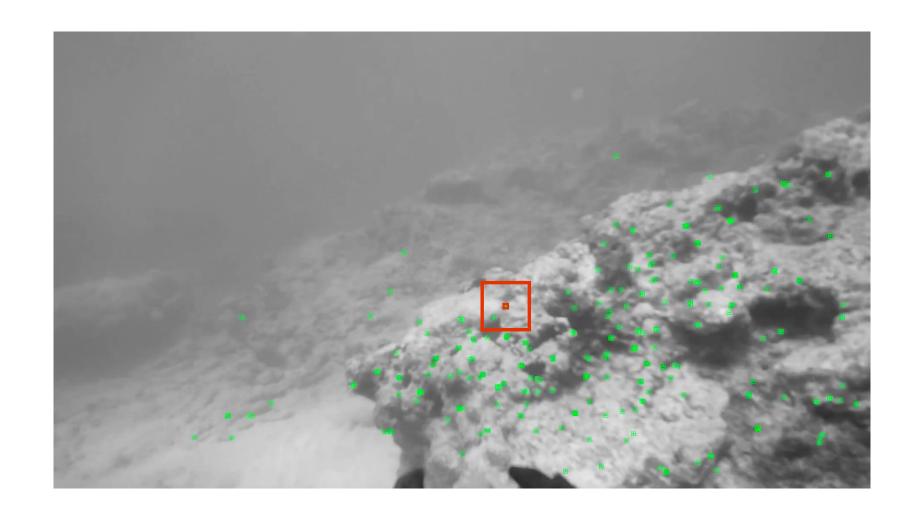


0.98 m





# ORB-SLAM Implementation



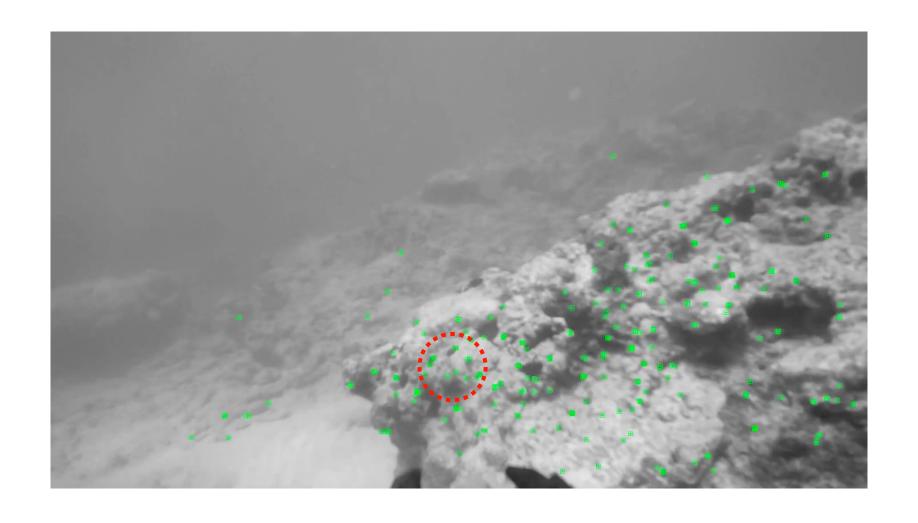
## **ORB-SLAM Implementation**



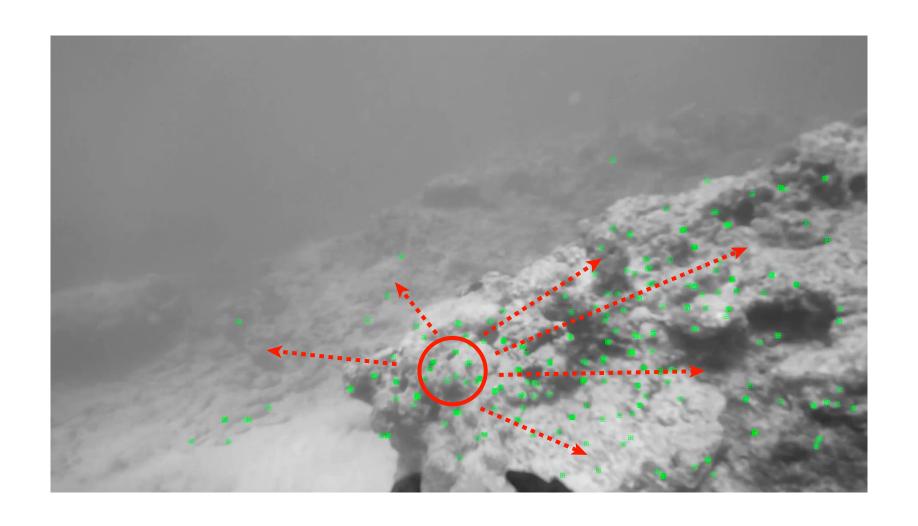


Raw Corrected

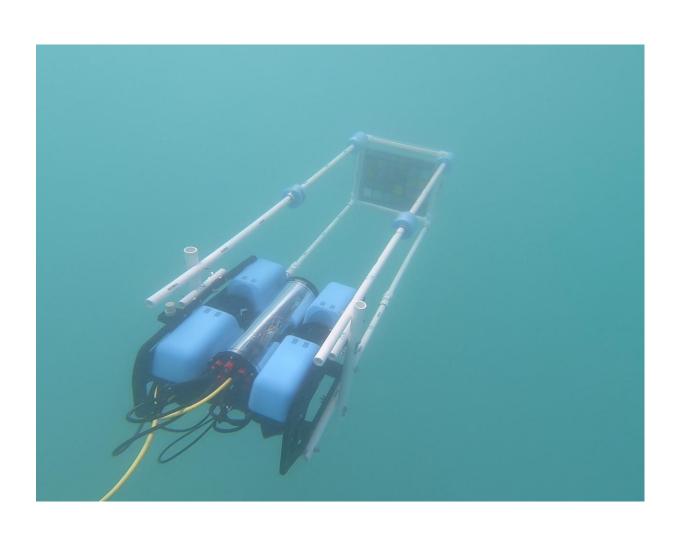
# Integration of Echo Sounder



# Propagate Depth Adjustments



#### Initialization and Calibration



- Color Chart for collecting attenuation values
- 3D structure with known irregularities to match echo sounder readings to tracked ORB-SLAM features

#### Future Work

- Integrate the echo sounder readings into the experiments
- Quantify the improvement in monocular SLAM and image color correction
- Extend experiments to account for different underwater environments
- Apply method to the BlueROV2 and a surface vehicle