#### Machine Learning Applications for Satellite Derived Bathymetry

Grant-Funded Research to Meet Seabed 2030 Objective

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#### National Science Foundation Small Business Innovation and Research Grant



Project Trident: A Three-Pronged Automated Solution to Satellite Derived Bathymetry



**TCARTA** 





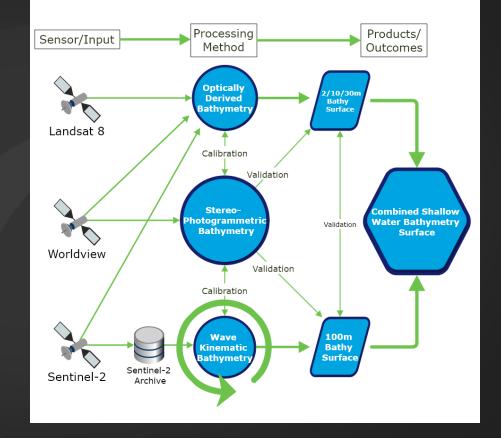
## **Project Trident Processing Scheme**

Trident's innovation will improve affordability, accessibility, integrity and modernity of global shallow water bathymetric data.

Establish intelligent automated SDB approach

Create deep-learning solution to suitability analysis

Combine three physics-based Satellite Derived Bathymetry techniques

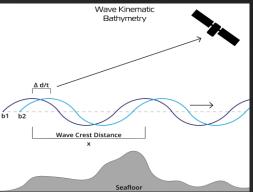


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#### Wave Kinematic Bathymetry

Works in clear and turbid waters

Requires proper metocean conditions



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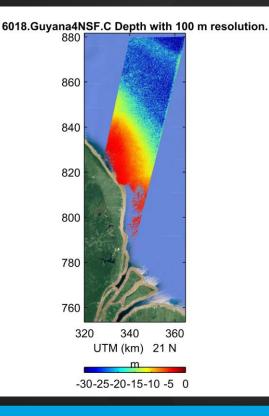
Exploits the relationship between the change in the velocity of waves, and water column depth

20-200m resolution bathymetry, improves with additional images

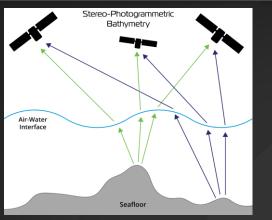
Ongoing collection of freely available Sentinel 2 imagery provides 60-70 suitable images per year for processing

Ever-improving bathymetry model with 150-200 images available per area

Non-navigational but useful for hydrodynamic modeling, survey planning



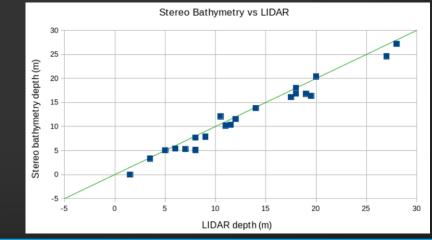
#### Photogrammetric Bathymetry: St. Croix



Stereo-derived depth points



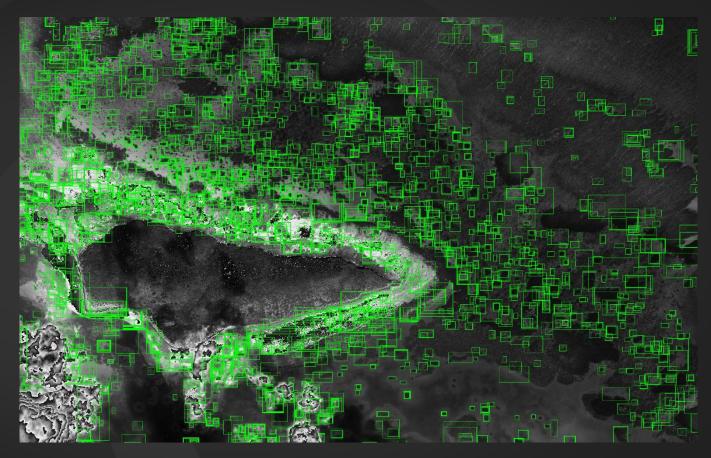
- Object-based elevation extraction
- Leverages DigitalGlobe archive imagery
  - Does not require stereo pairs
- Very high resolution imagery used to validate lower resolution
- Elevations referenced to Geoid, adjusted to local tidal datum
- 2 images minimum, 5+ optimal
- Validation for Optical SDB and WKB



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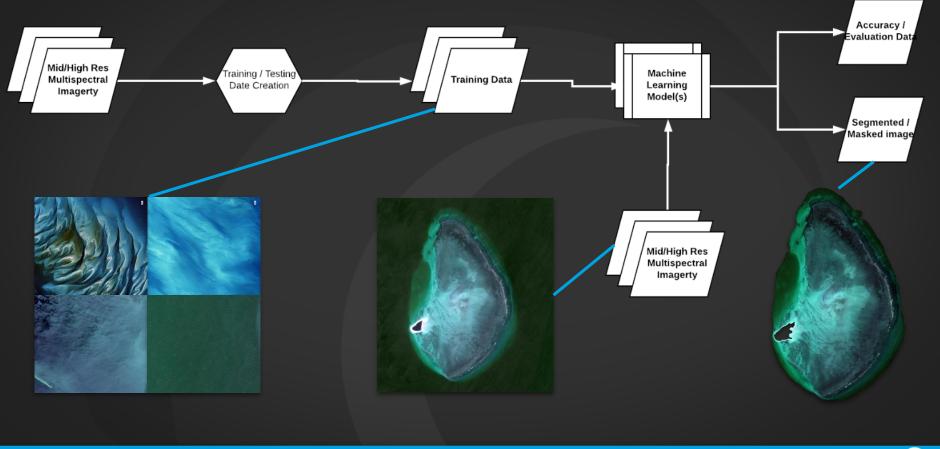
## **Targeted Segmentation**

- Panchromatic/ Multispectral Segmentation
- Tunable parameters to local bottom characteristics, desired object size and number
- Human 90% out of workflow
- object matching metrics to ensure only good matches utilized
- ~1000 times more extracted points than manual approach





# Machine Learning for SDB





#### Automated Detection and Allocation of Suitable Image Segments

1. Original Image

Old method: manual process takes trained and experienced operator to mask area of turbidity, clouds, extinction depth, etc

2. Automated suitability detection

New method: Images are assessed for metocean conditions and water quality and automatically allocated to appropriate processes based on Machine Learning



3. Masked image sent to physics-based SDB



## Trial Areas Within MACHC



Six trial locations have been chosen to test the three methods and automated suitability segmentation, three residing within MACHC domain **South Florida** - varying water clarity for testing automated image segmentation

**St. Croix** - location for all three methods and in situ data

Guyana - Highly suitable for WKB





## Project Trident Provides Ultra-Low Cost Option to Meet the Specifications of the Seabed 2030 Initiative

...and tsunami inundation preparation



## The Nippon Foundation-GEBCO Seabed 2030 Project

Seabed 2030 is a collaborative project between the Nippon Foundation and GEBCO. It aims to bring together all available bathymetric data to produce the definitive map of the world ocean floor by 2030 and make it available to all. It builds on more than 100 years of GEBCO's history in global seafloor mapping.

https://seabed2030.gebco.net/



# Learn More and Get Involved

#### www.trident.tcarta.com



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TCarta is developing business cases and market validation. We are seeking partnerships for third-party beta-testing.



\*\*\*available in Spanish - 4 December, 2018\*\*\*

