

# Biomass Estimation with GEDI and OBI-WAN

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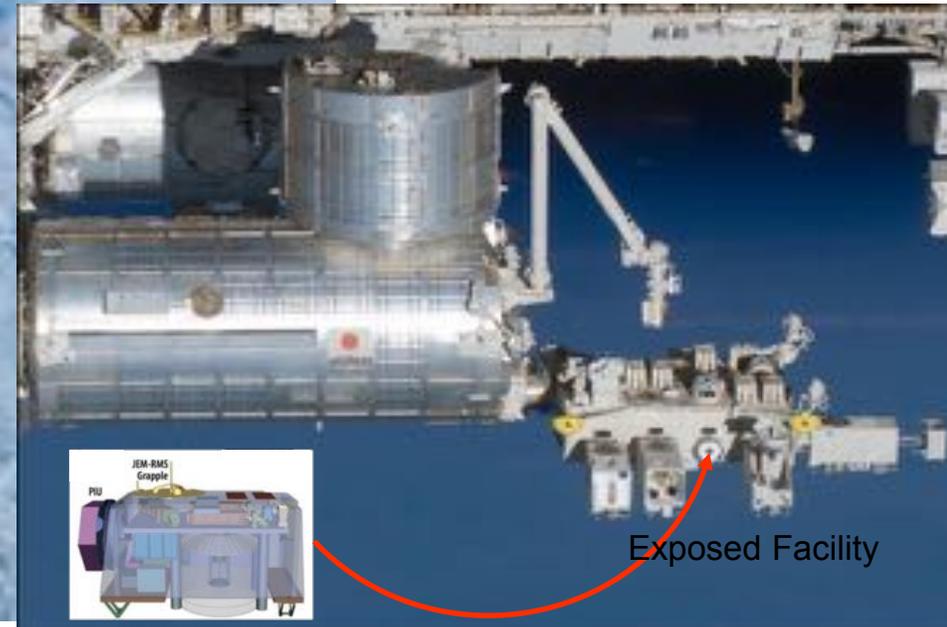
# GEDI (Global Ecosystem Dynamics Investigation)



Investigator-led Venture-Class mission, launching 2018/19  
(PI: Dubayah)



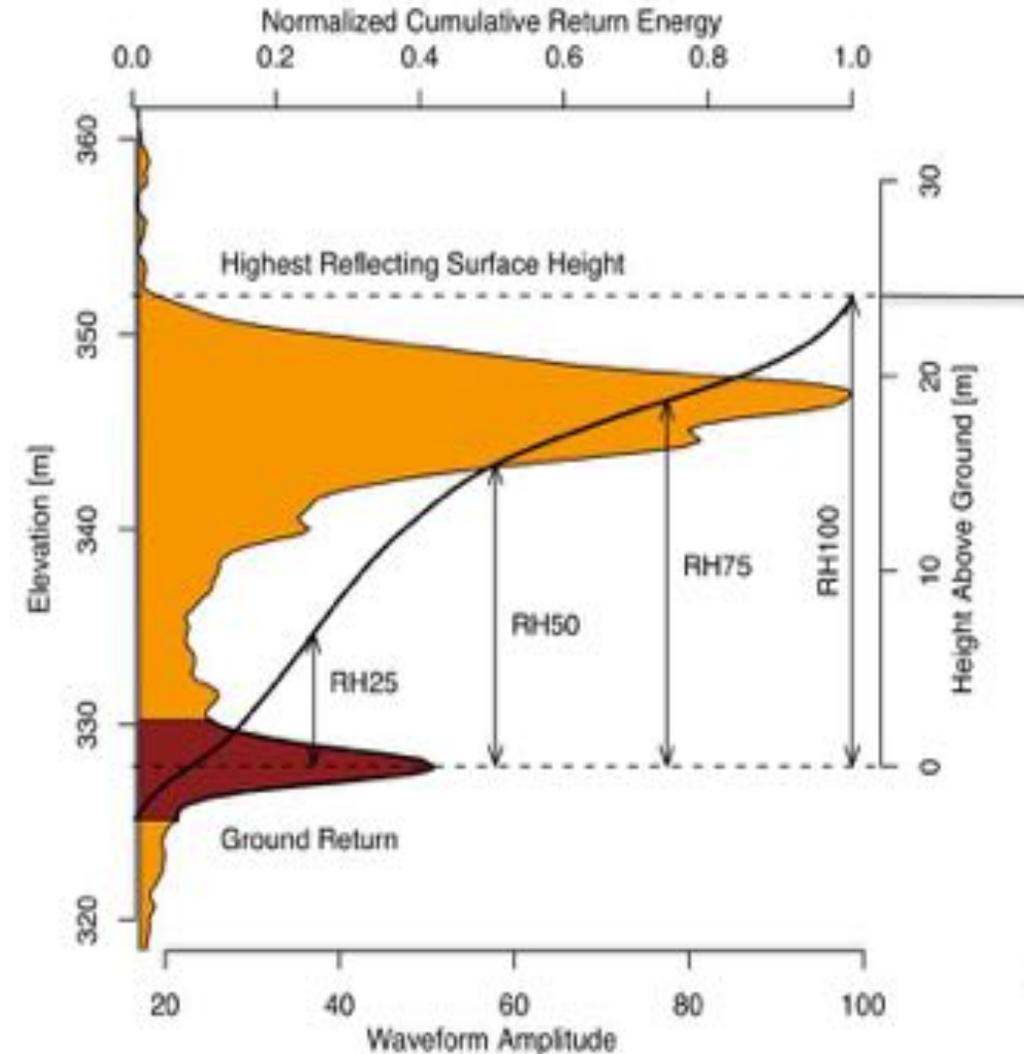
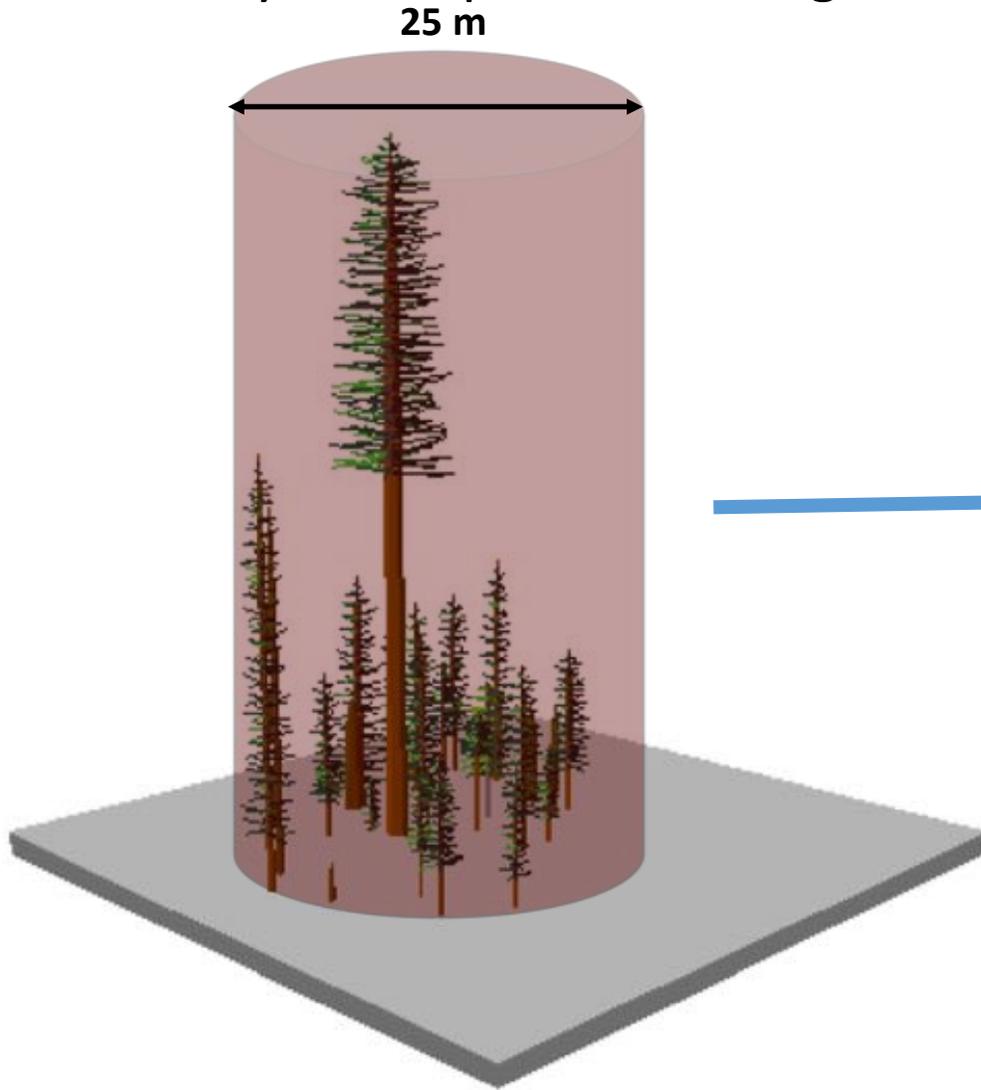
SPACE-X  
DRAGON  
CAPSULE

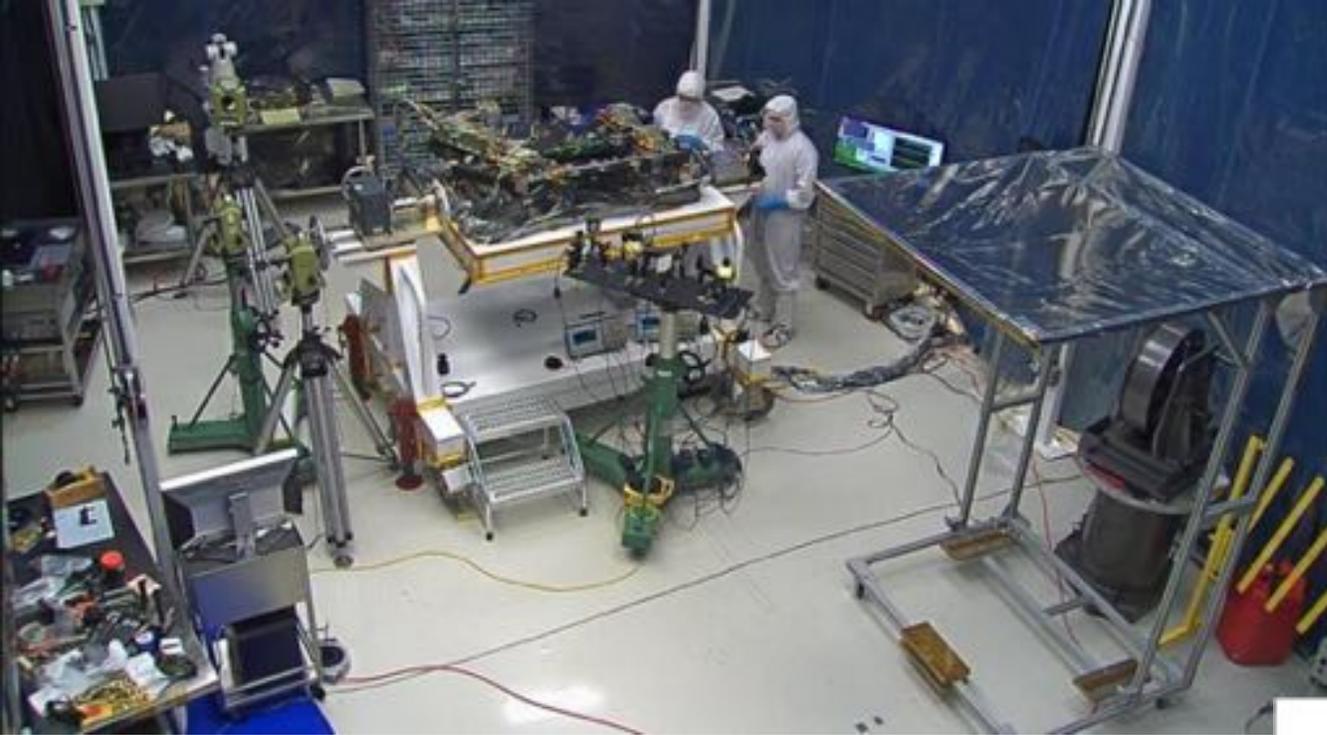


Exposed Facility

# GEDI observes canopy structure by collecting “waveform” data over 25-m footprints

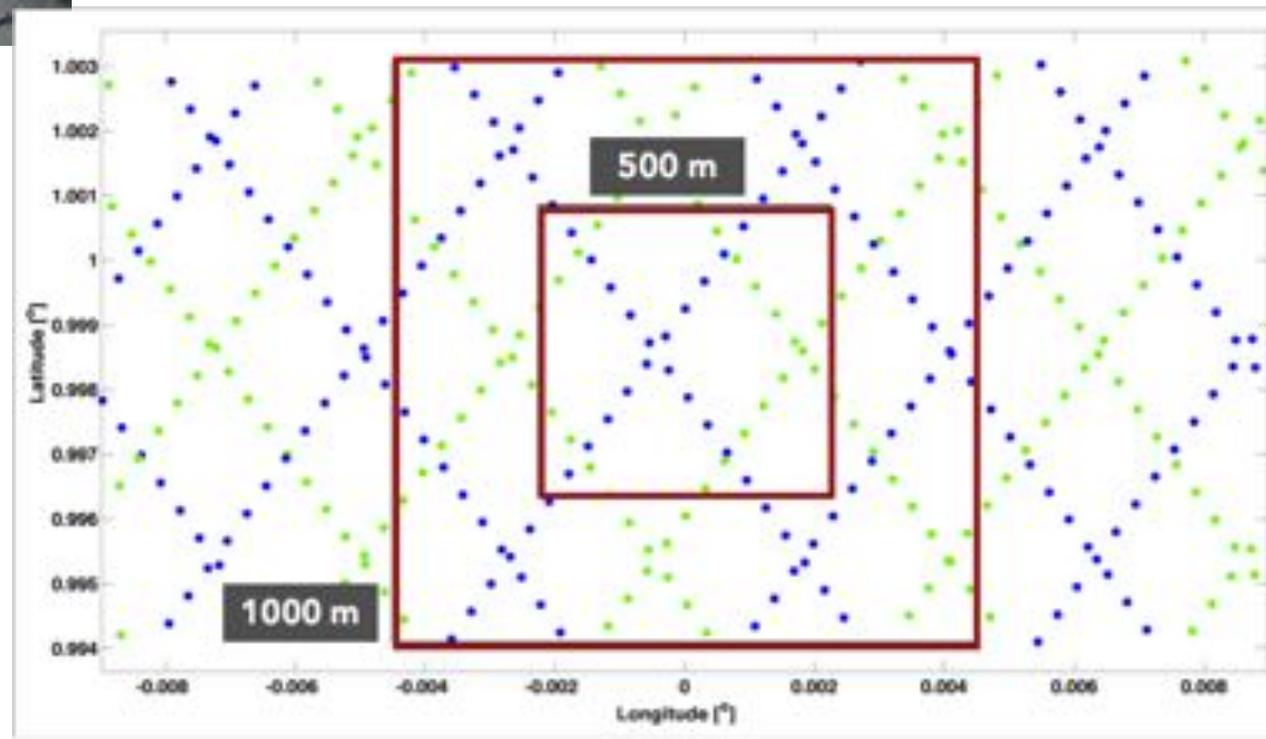
- Waveforms describe how dense the canopy is at different heights above the ground
- 20 years experience using similar measurements from LVIS





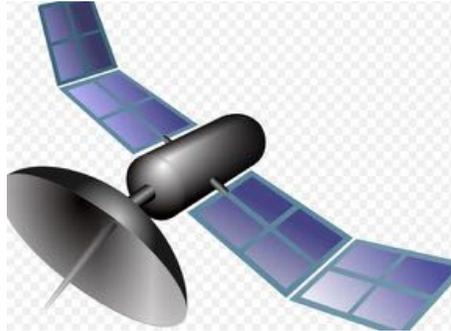
GEDI Launch Readiness Date:  
27 November, 2018  
Range: 51°S to 51°N

Footprints will be acquired roughly in a lattice pattern (500-m cross track, 60-m along-track spacing), although the forest in many cases will be obscured by clouds



# Challenge: Turn multiple 22m-footprint waveforms in a given spatial domain (including each 1km grid cell) into an estimate of mean biomass (with uncertainty)

How do we think about inference?



## Remote Sensing

## Inventory

**Basis for estimate**

Add up the pixels

Sample theory

**Basis for uncertainty**

Predicted vs. observed

Sample theory (sample variance and number)

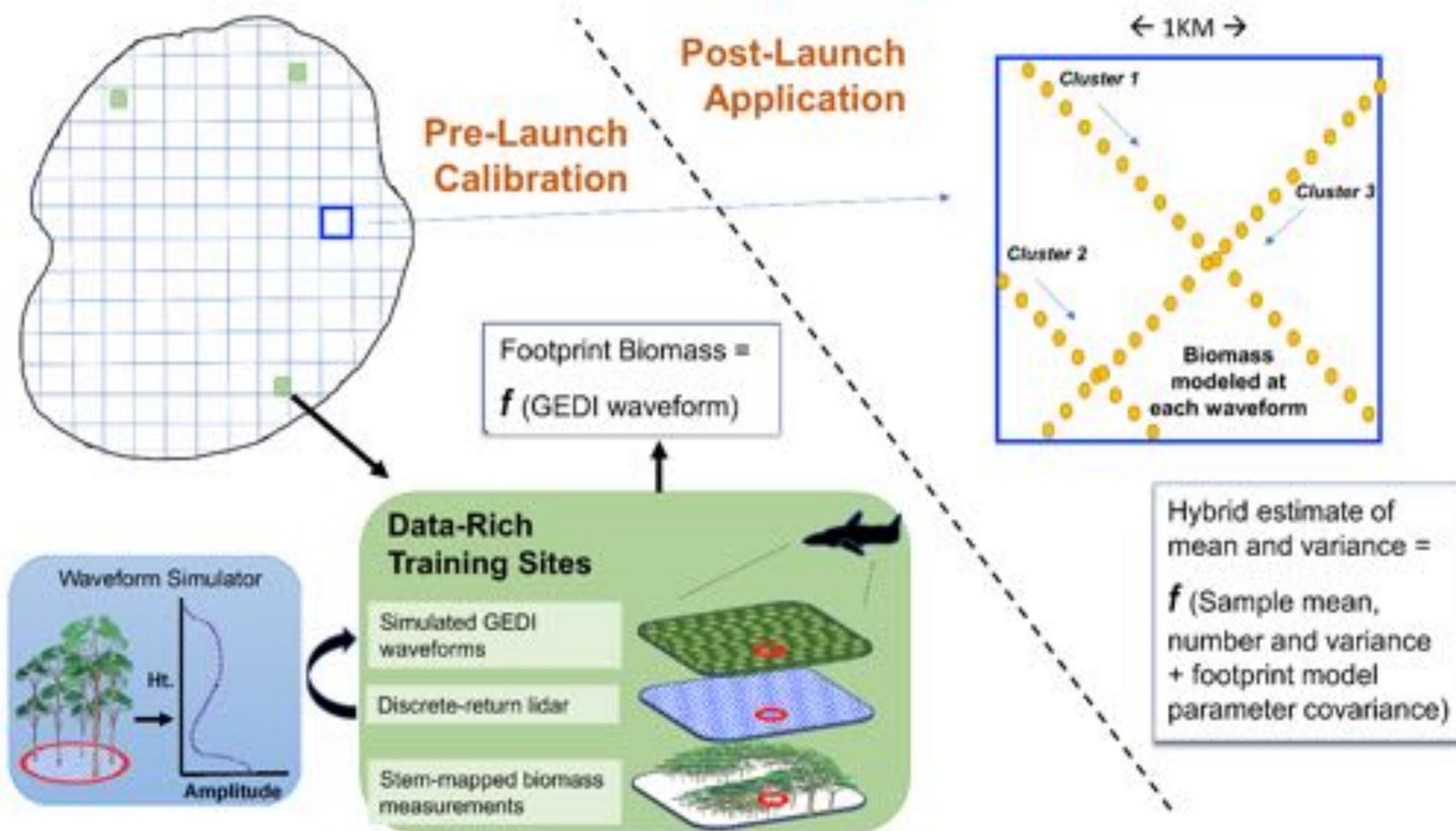
**Measure of uncertainty**

RMSE,  $r^2$

Standard Error

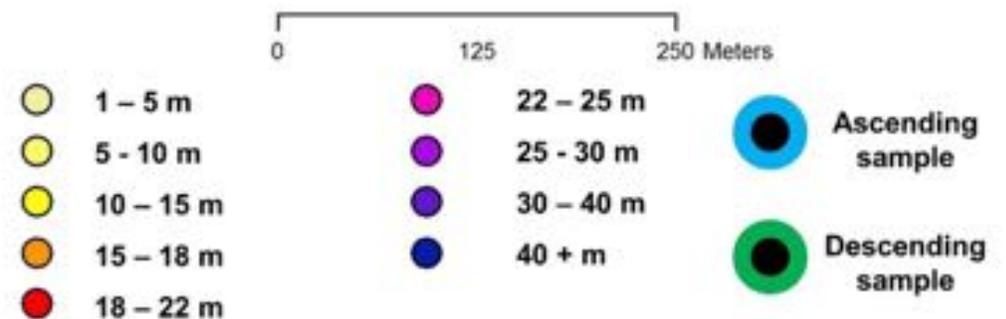
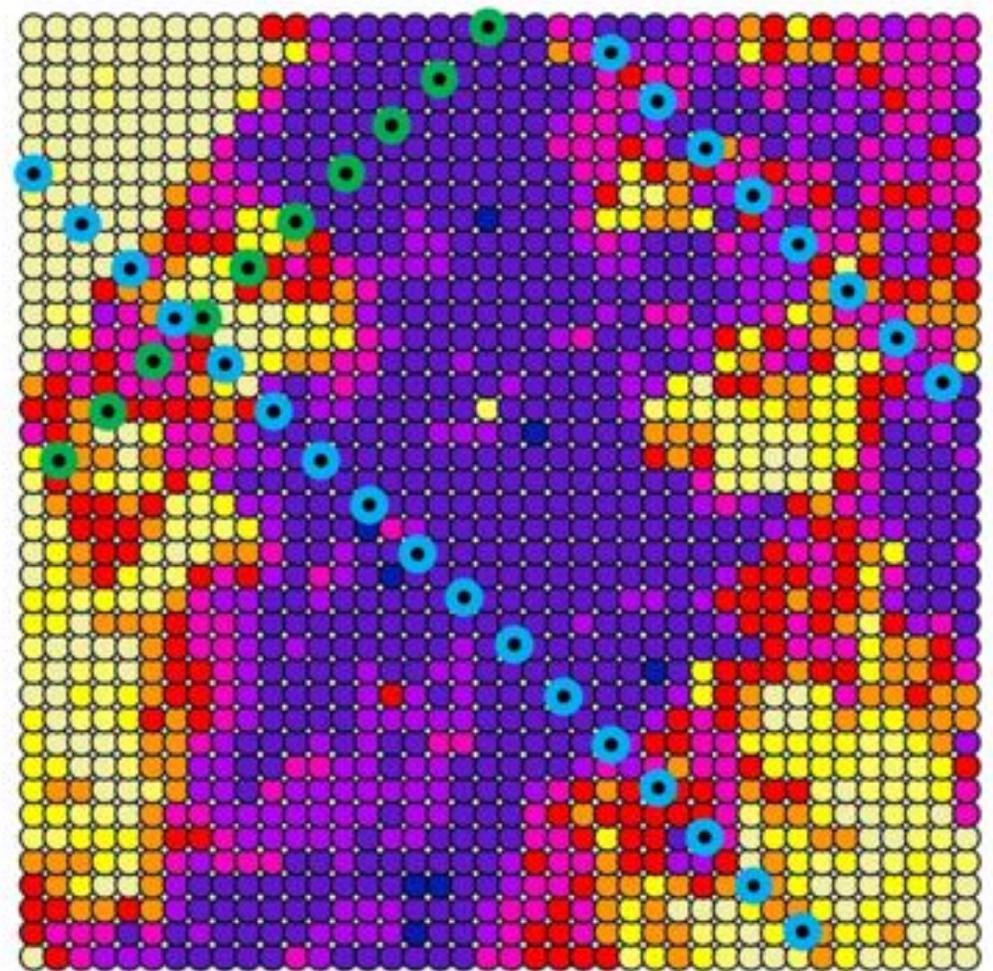
This dichotomy is changing

# We are using a pre-launch calibration approach with hybrid inference



We see the 1-km grid cell as a finite population that is being sampled using a clustered design

Variance estimators at the 1-km scale (or for larger and/or irregularly shaped domains) consider both sample design and model covariance



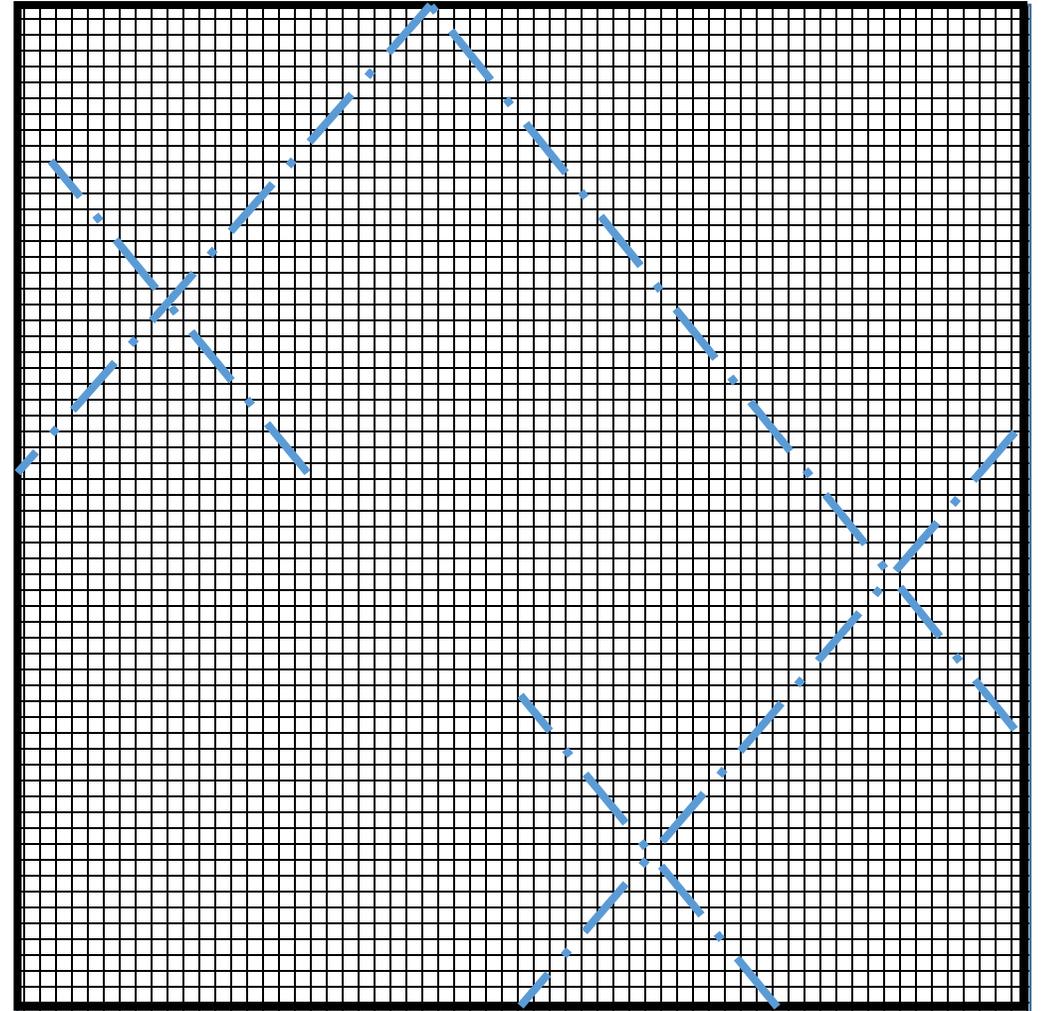
Supplementing GEDI with wall-to-wall imagery will allow us to make estimates for areas obscured by clouds and may reduce our standard errors

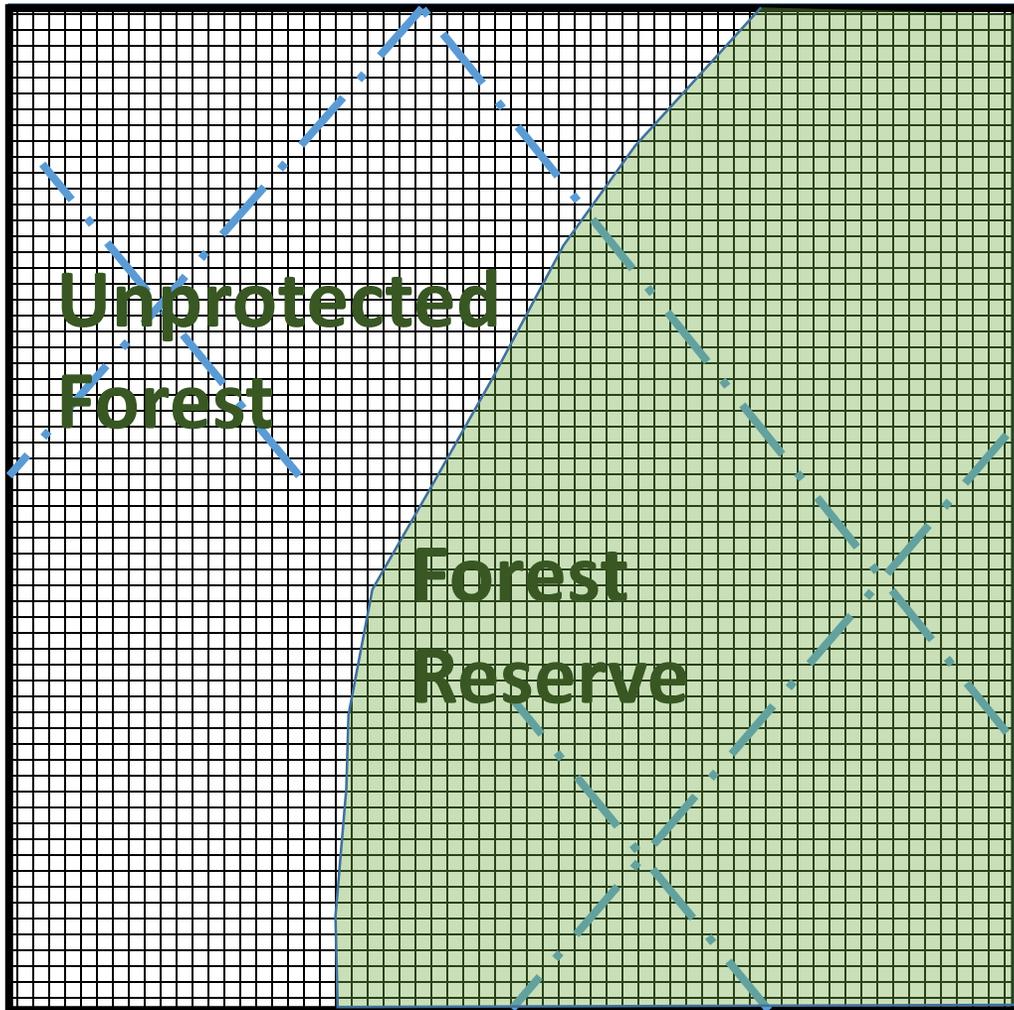
## Hierarchical Model-Based Inference

- **Model biomass: ground → GEDI → Local Landsat (or NISAR or Tandem-X )**
- **Account for multiple levels of model uncertainty**
- **Add up the Landsat-scale predictions**

Saarela et al. (2016) *Annals of Forest Science*

Saarela et al. (In review) *Remote Sensing*





There is no reason hierarchical model-based inference should be limited to grid cells



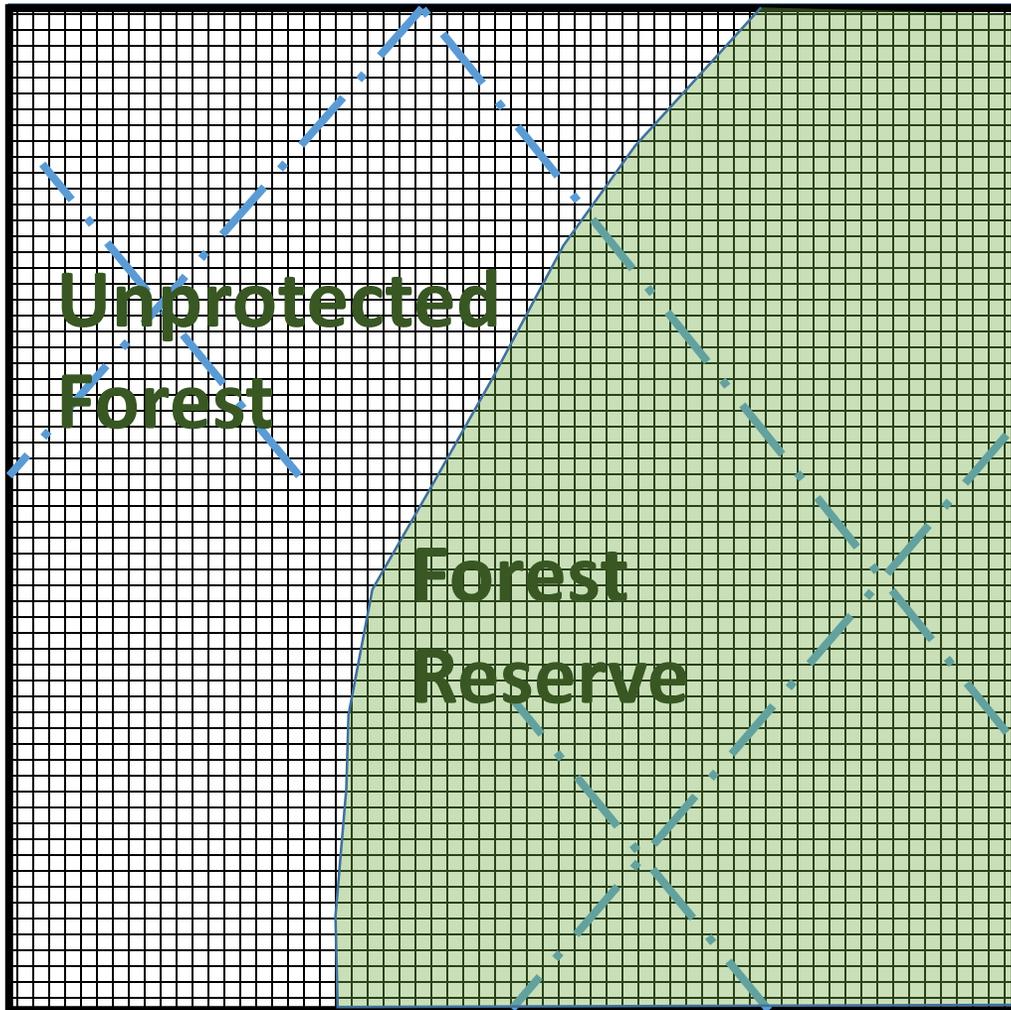
# OBI-WAN

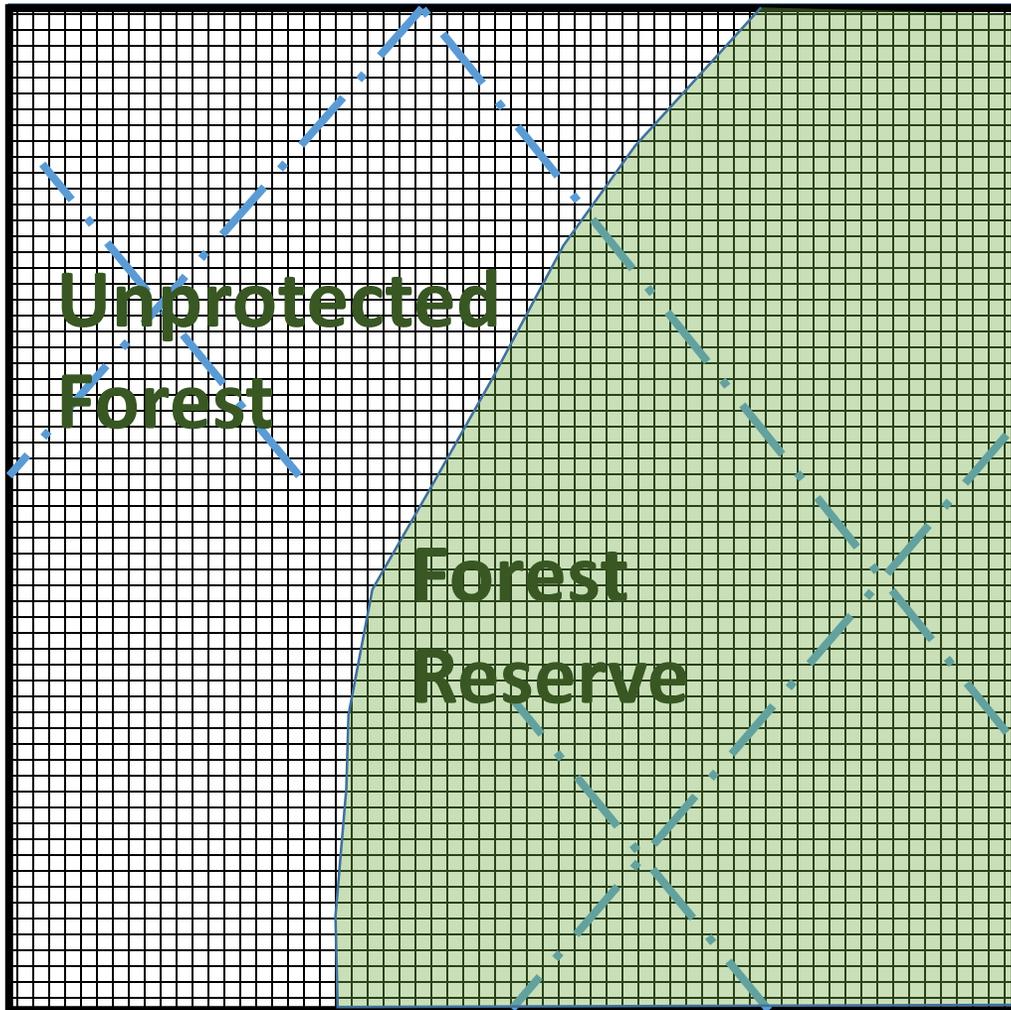
Online Biomass  
Inference using  
Waveforms And  
iNventory



## OBI-WAN

1. User inputs shapefile to a Google Earth Engine app (200-hectare minimum)
2. OBI-WAN accesses GEDI's plot/model/lidar database, supplemented with Landsat archive stored on Google Earth Engine
3. Uncertainty is tracked through hierarchical model-based inference
4. Customized forest biomass report is generated, including estimates of mean biomass, standard error of the mean, and thorough documentation





Potential applications of OBI-WAN include reporting carbon stocks for:

- Forest reserves
- Individual companies
- Municipalities from villages to countries

**Estimates of forest carbon will be available through OBI-WAN starting in mid-2020**

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