

# Investigating the impact of spatially-explicit sub-pixel structural variation on the assessment of vegetation structure from imaging spectroscopy data

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- Error analysis

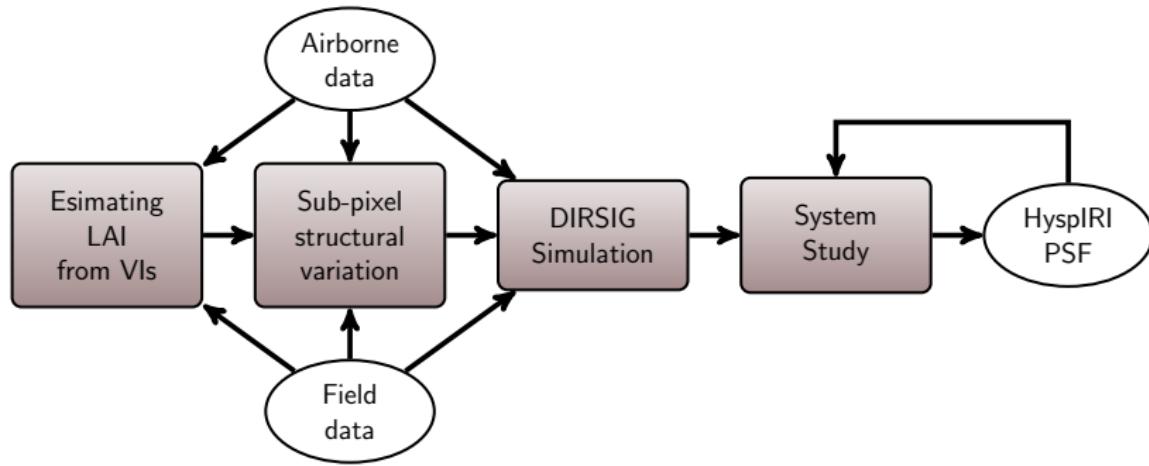
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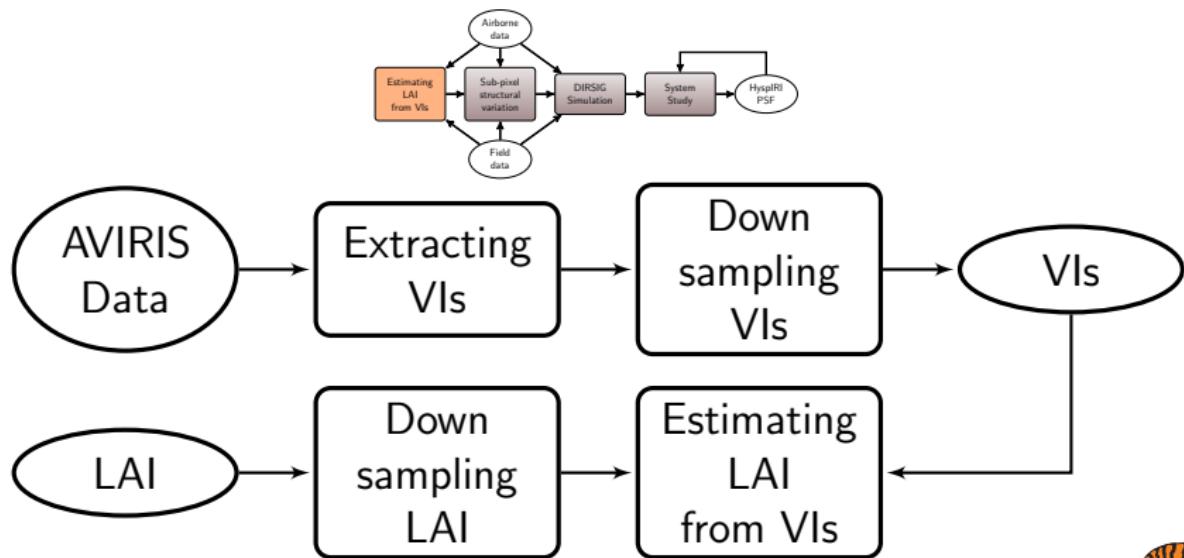
# Introduction

## Project outline



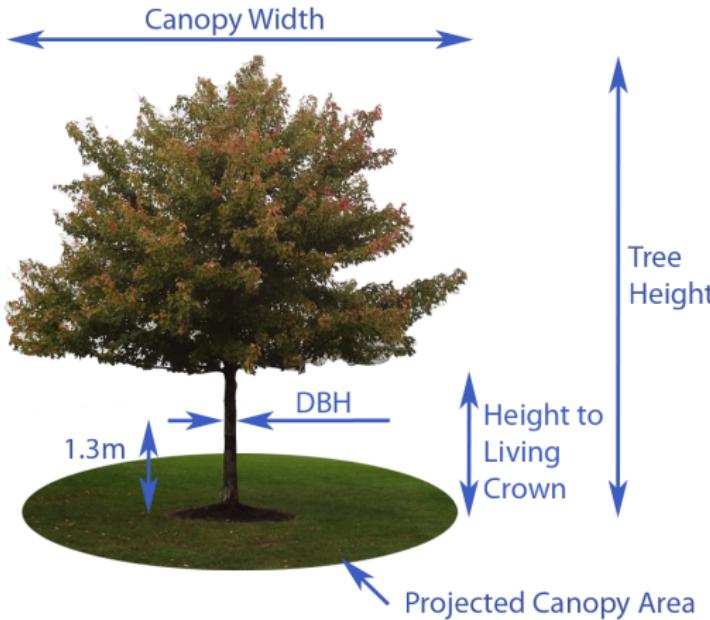
# Introduction

## Project outline



# Introduction

## Vegetation structural measurements



- Tree height
- Canopy width
- Height to living crown
- Diameter at breast height (DBH)
- Leaf area index (LAI)



# Introduction

## Vegetation indices (VIs)

*Spectral indices* are transformations applied to remotely sensed data to enhance some characteristic of the surface.

*Vegetation indices* are a type of spectral index for estimating forest biophysical variables.

The most widely used of these transformations is the “normalized difference vegetation index” (NDVI).

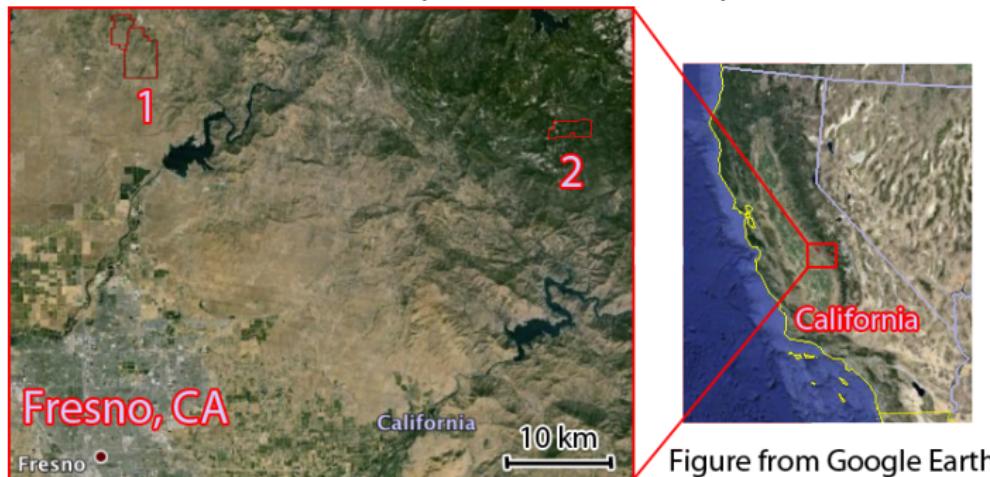


# Methods

## Study area

The National Ecological Observatory Network (NEON),  
Pacific Southwest Domain (D17)

- ① San Joaquin Experiment Range (Core site)
- ② Soaproot Saddle (Relocatable site)



# Methods

## Field collection

- ① San Joaquin Experiment Range, June 9 - 14, 2013  
12 sites (AOP #): 4, 8, 36, 112, 116, 361, 824, 952



AOP 36



AOP 116

AOP: Airborne Observation Platform



# Methods

## Field collection

② Soaproot Saddle, June 16 - 20, 2013

8 sites (AOP #): 43, 63, 95, 143, 299, 331, 555, 1611



AOP 43



AOP 1611

AOP: Airborne Observation Platform



# Methods

## Airborne collection

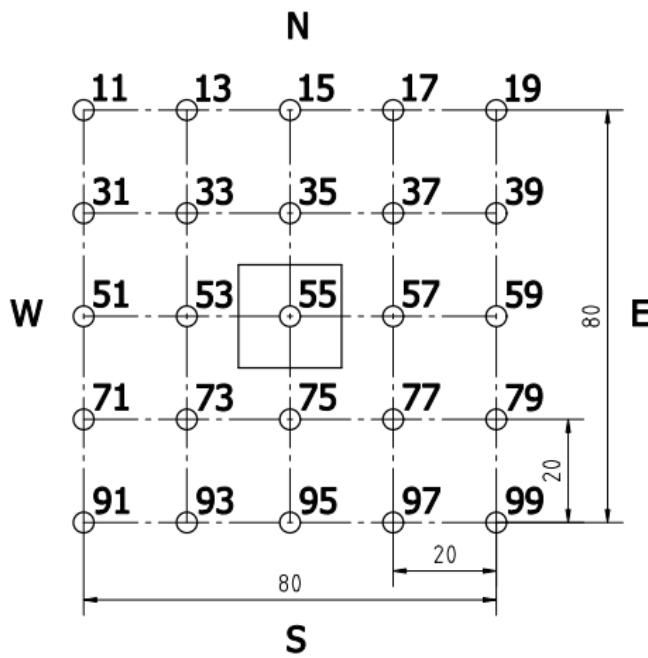
AVIRIS data collected during HyspIRI preparatory airborne campaign, summer 2013:

- June 12, 2013: f130612t01r09 (San Joaquin)
- June 12, 2013: f130612t01r07 (Soaproot)
- June 26, 2013: f130626t01r13 (San Joaquin)
- June 26, 2013: f130626t01r07 (Soaproot)



# Methods

## Field collection



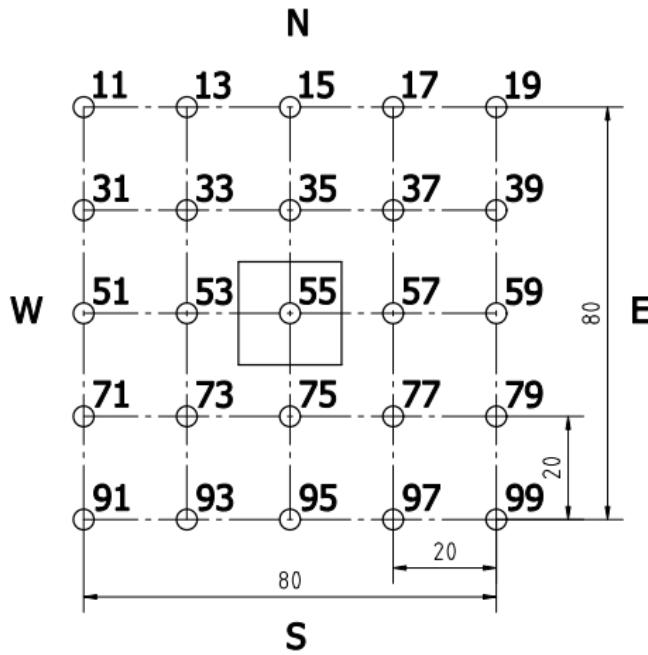
Measurements at NEON's  
20 × 20m AOP:

- ① Stem maps
- ② Height
- ③ DBH
- ④ Species



# Methods

## Field collection



Measurements at each spot  
within  $80 \times 80m$  site:

- ① LAI (AccuPAR LP-80)
- ② Ground based lidar  
(SICK LMS-151, RITTL)
- ③ Spectra (SVC HR-1024i)
- ④ Grass biomass  
(only in San Joaquin)
- ⑤ GPS position
- ⑥ Pictures



# Methods

## Definitions of vegetation indices

Simple Ratio VI (SR):

$$SR = \frac{R_{800}}{R_{670}}$$

Normalized Difference Vegetation Index (NDVI)

$$NDVI = \frac{R_{800} - R_{670}}{R_{800} + R_{670}}$$

Modified Chlorophyll Absorption Ratio Index (MCARI),  
Improved version of MCARI (MCARI2)

$$MCARI = [(R_{700} - R_{670}) - 0.2(R_{700} - R_{550})](R_{700}/R_{670})$$

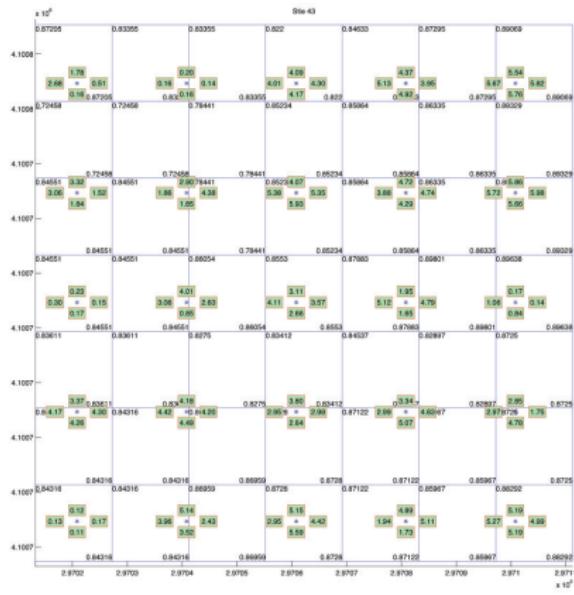
Triangular Vegetation Index (TVI), Modified TVI (MTVI1)



# Methods

## Mapping LAI to VIs

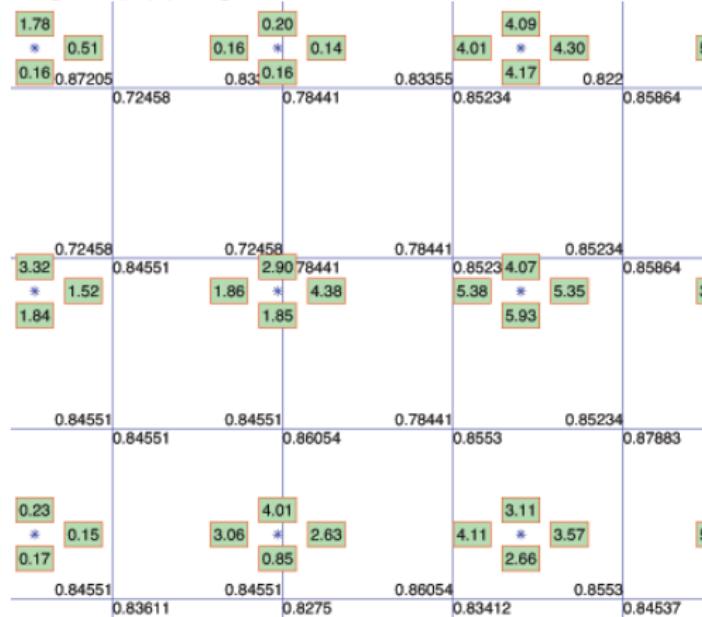
### AOP site 43



# Methods

## Mapping LAI to VIs

### AOP site 43



# Methods

## Mapping LAI to VIs

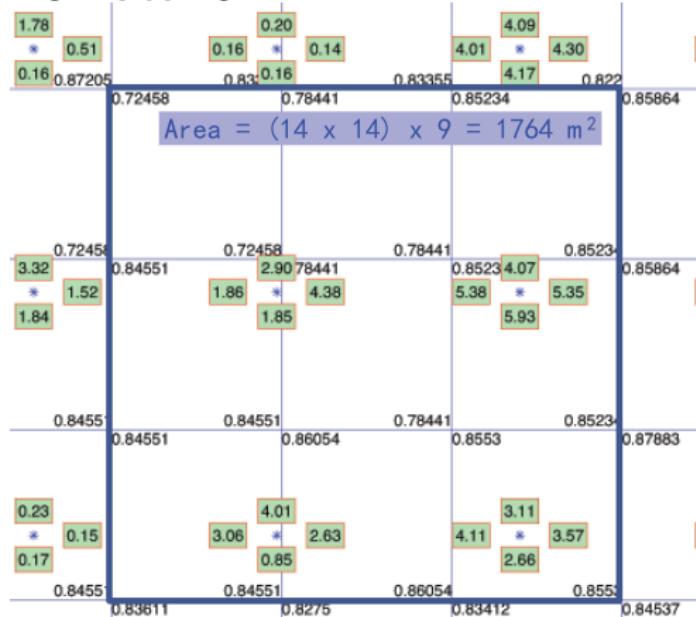
### AOP site 43



# Methods

## Mapping LAI to VIs

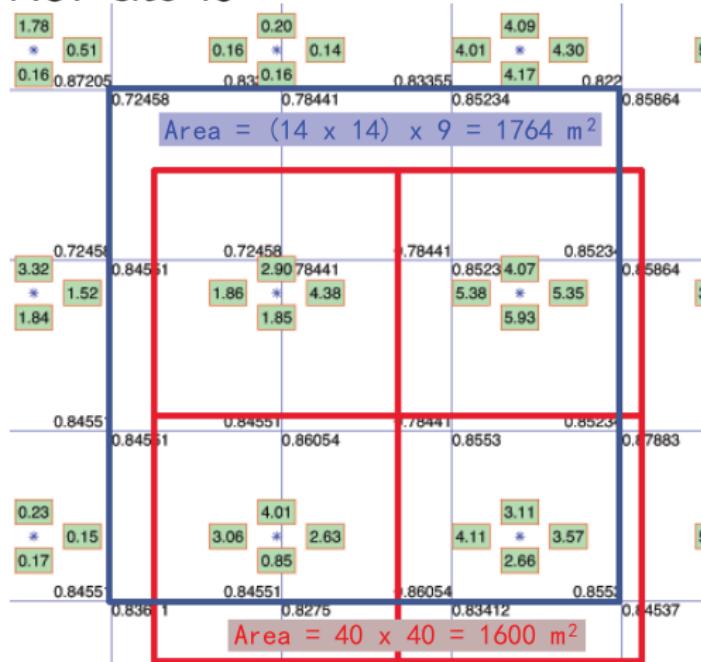
### AOP site 43



# Methods

## Mapping LAI to VIs

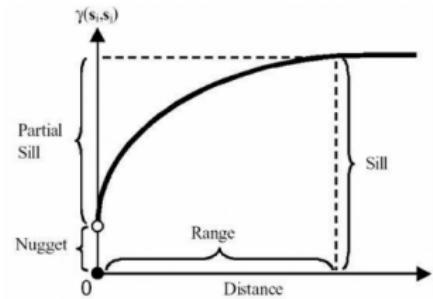
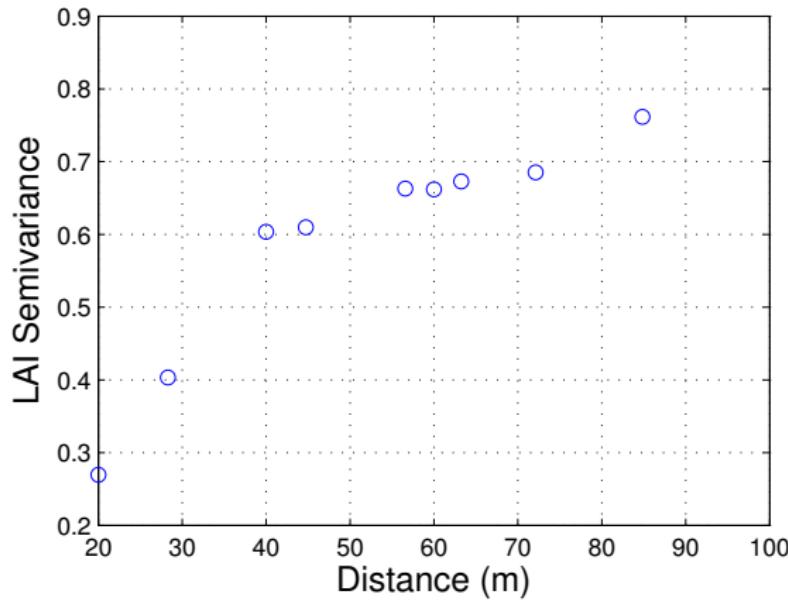
### AOP site 43



# Methods

## Mapping LAI to VIs

### Semi-variogram



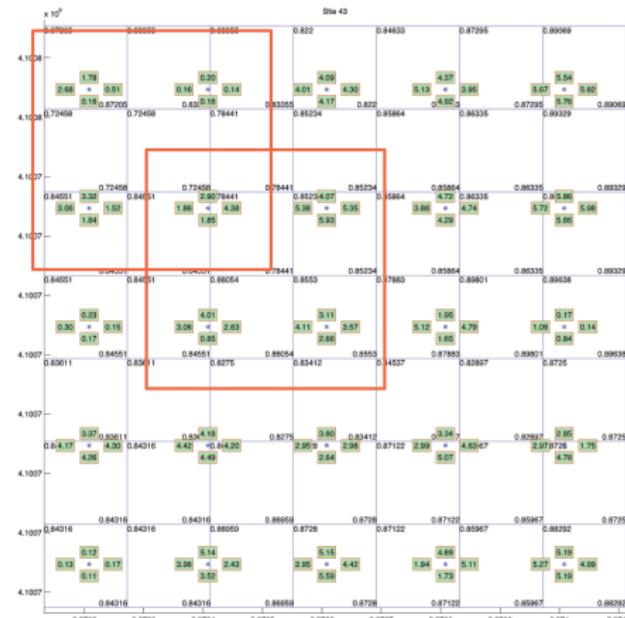
A theoretical semi-variogram.  
[http://planet.botany.uwc.ac.za/nisl/GIS  
/spatial/chap\\_1\\_48.htm](http://planet.botany.uwc.ac.za/nisl/GIS/spatial/chap_1_48.htm)



# Methods

## Mapping LAI to VIs

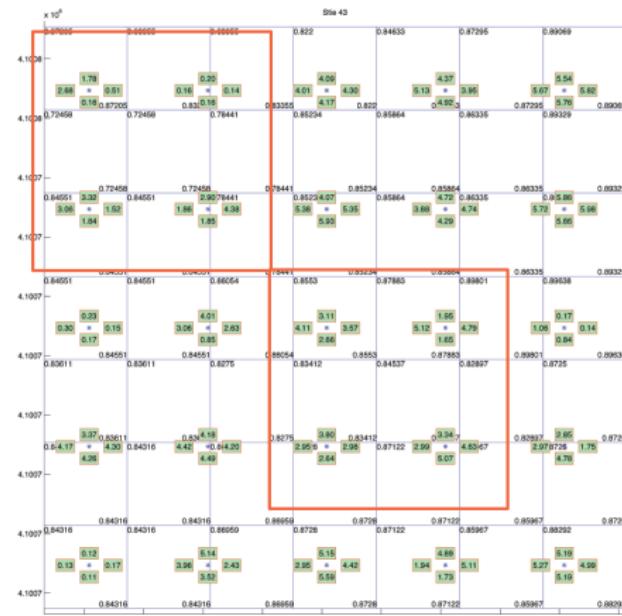
### AOP site 43



# Methods

## Mapping LAI to VIs

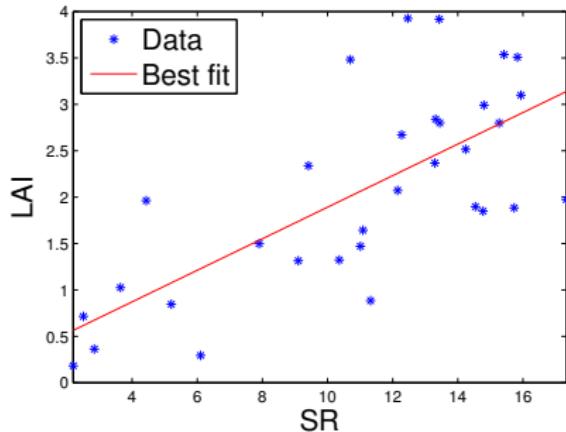
### AOP site 43



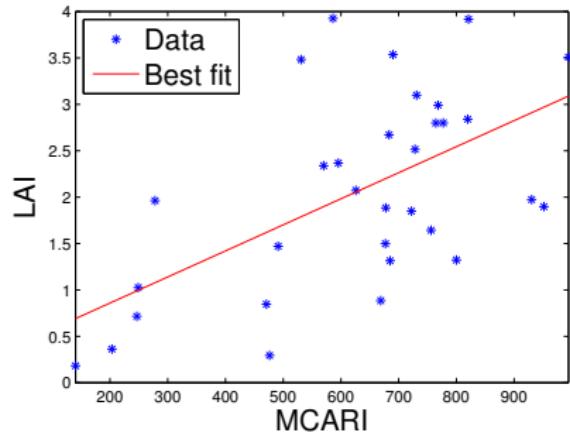
# Results

## LAI estimation

Linear function:  $LAI = a \cdot VI + b$



SR  
 $R^2 = 0.51$



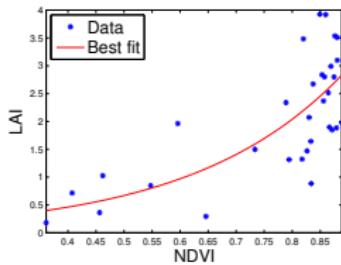
MCARI  
 $R^2 = 0.33$



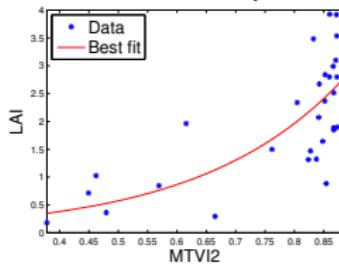
# Results

## LAI estimation

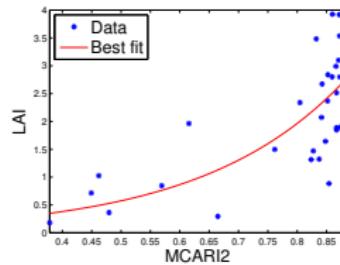
Exponential function:  $LAI = a \cdot \exp(b \cdot VI)$



NDVI  
 $R^2 = 0.52$



MTVI2  
 $R^2 = 0.51$



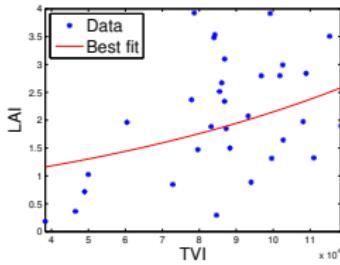
MCARI2  
 $R^2 = 0.51$



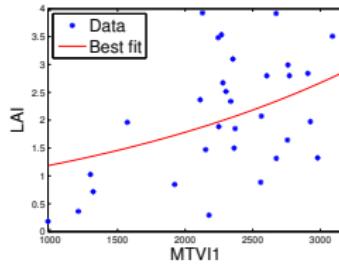
# Results

## LAI estimation

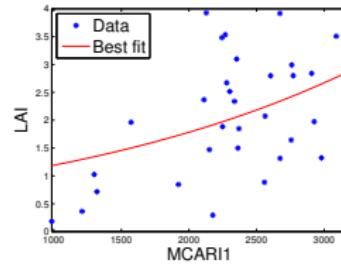
Exponential function:  $LAI = a \cdot \exp(b \cdot VI)$



TVI



MTVI1



MCARI1



# Results

## Error analysis

### Error on calculated VIs



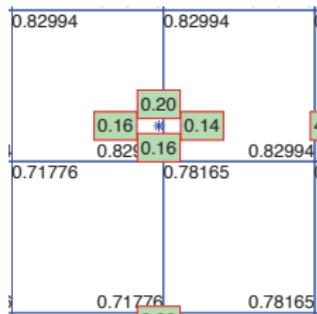
Site 143



# Results

## Error analysis

### Error on measured LAI



Site 43, spot 13



# Conclusions/Outlook

## Conclusions

### Conclusions:

- ① Both LAI and VI are scalable based on consistent results:  
LAI:  $20m \rightarrow 40m$ , VI:  $14m \rightarrow 42m$
- ② SR, NDVI, MCARI2 can be potentially used to estimate LAI from HyspIRI data, although fit improvements are required.



# Conclusions/Outlook

## Future work

### ① Improved estimation of VIs:

- Use other combinations of bands to calculate VI, find the best bands for HypsIRI data to estimate LAI

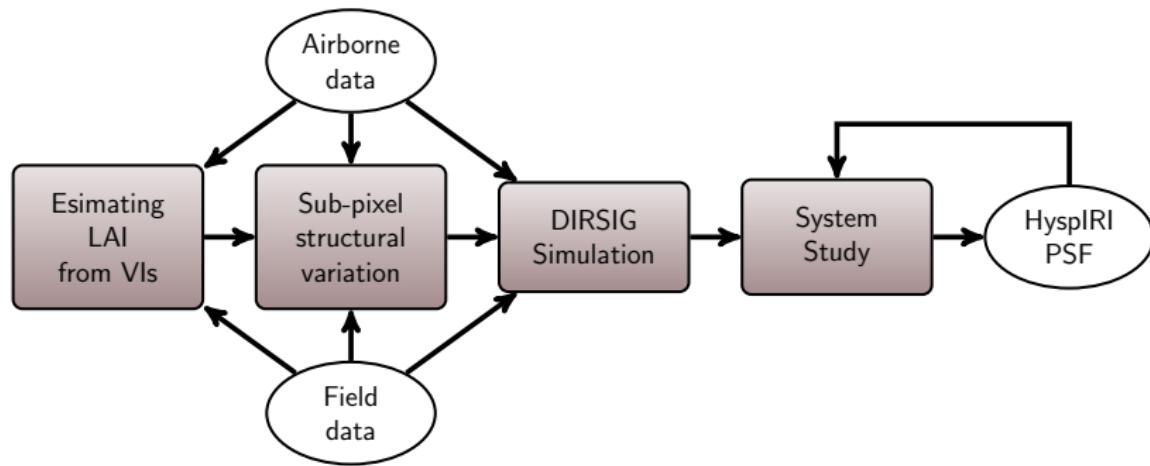
### ② Improved estimation of field LAI:

- Use high resolution NEON spectrometer and discrete lidar data to “unmix” coarser scale imaging spectroscopy data
- Based on height (short photosynthetic vegetation) and spectra



# Conclusions/Outlook

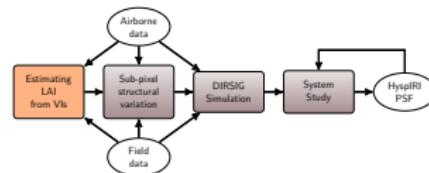
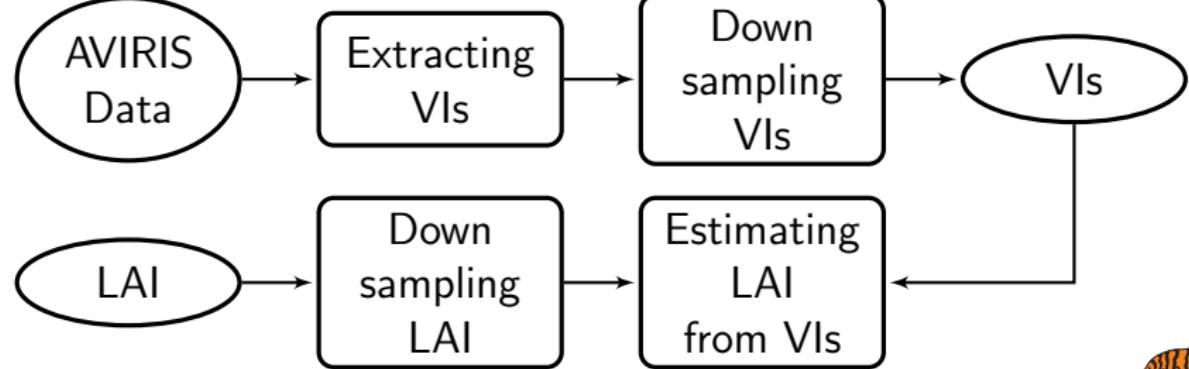
## Project outline



# Conclusions/Outlook

## Future work

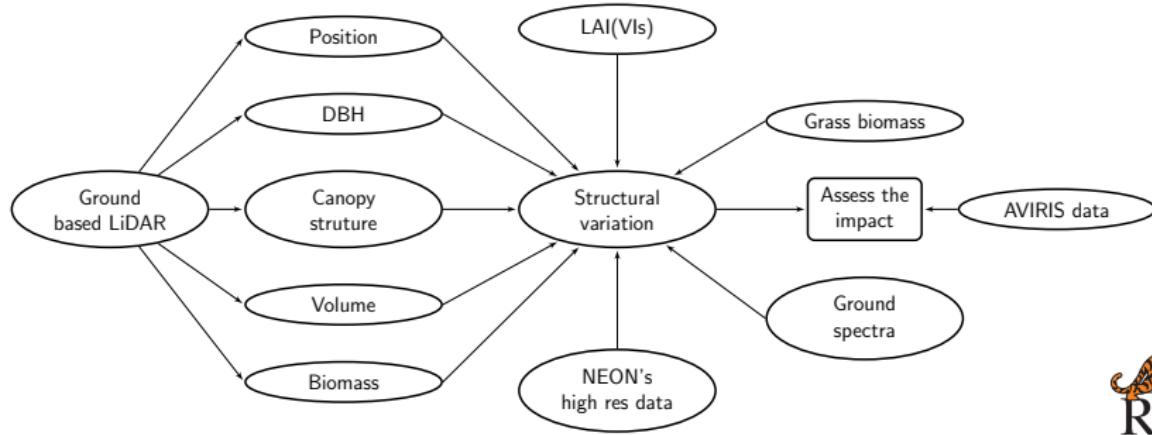
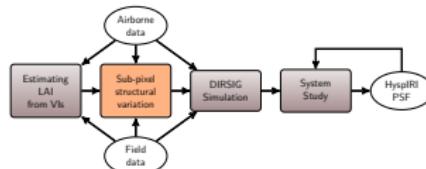
### Stage 1: Estimating LAI from VIs



# Conclusions/Outlook

## Future work

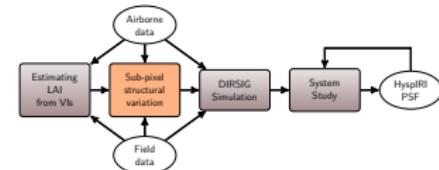
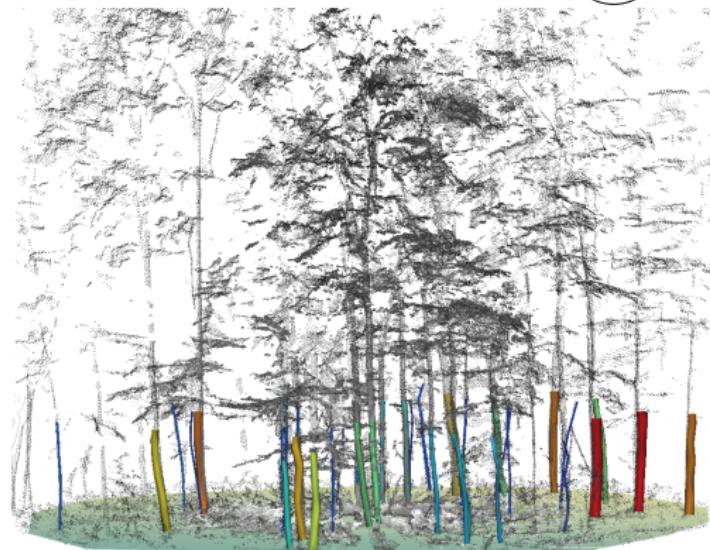
### Stage 2: Sub-pixel structural variation



# Conclusions/Outlook

## Future work

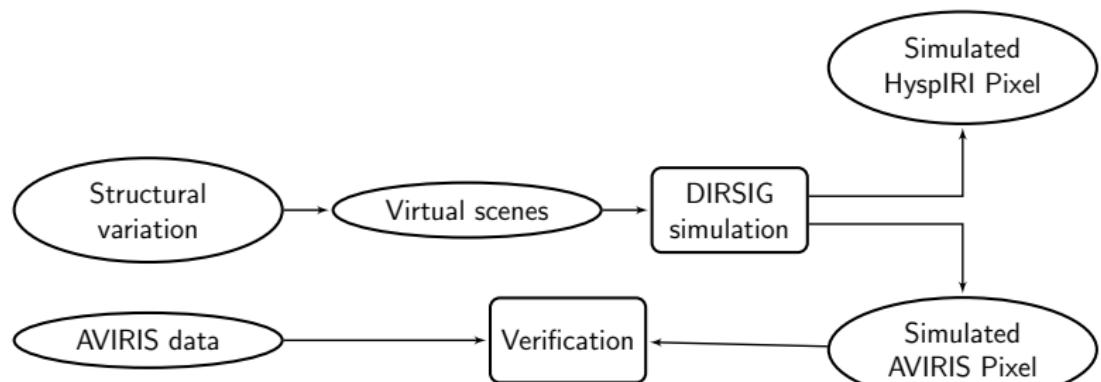
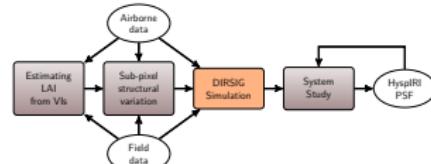
### Stage 2: Sub-pixel structural variation



# Conclusions/Outlook

## Future work

### Stage 3: DIRSIG Simulation



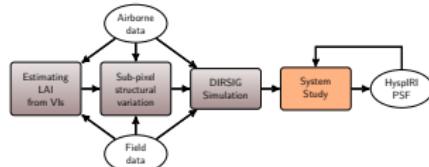
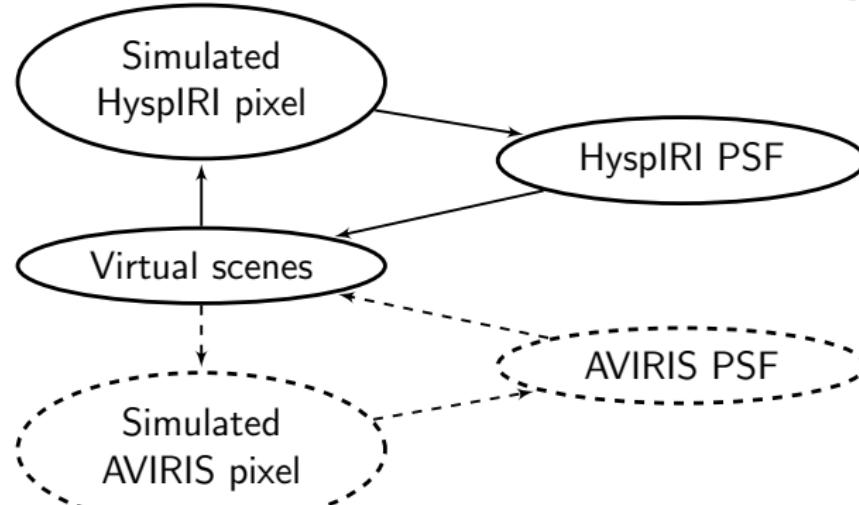
DIRSIG: The Digital Imaging and Remote Sensing Image Generation



# Conclusions/Outlook

## Future work

### Stage 4: System Study



# Acknowledgement

- This material is based upon work supported by the NASA HyspIRI Mission under Grant No. NNX12AQ24G.
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2013 Hyperspectral Science and Application Workshop

