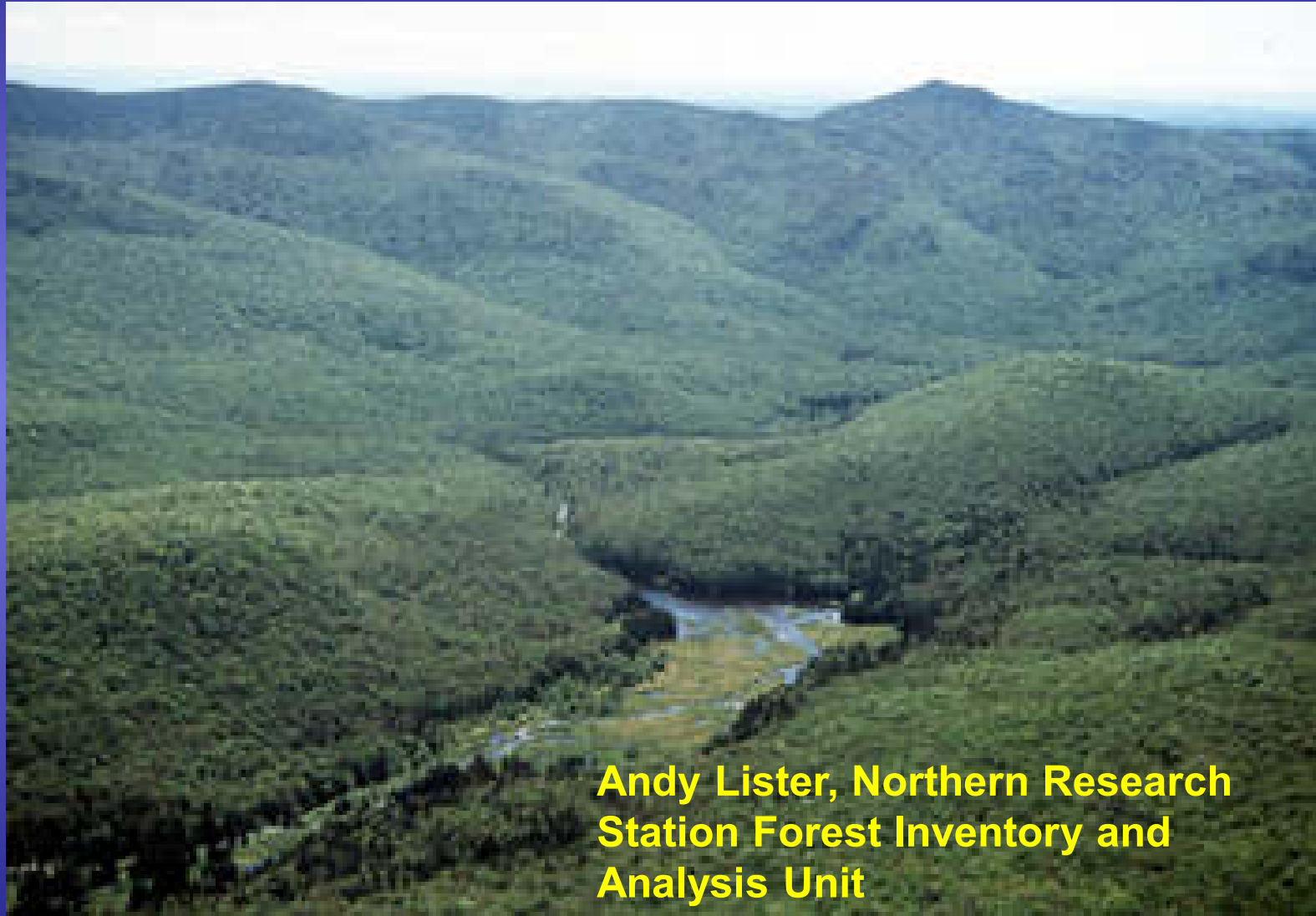


# Remote Sensing Use in the USFS Forest Inventory and Analysis Program, and How NASA Can Help

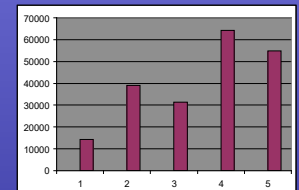
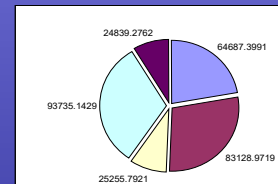


**Andy Lister, Northern Research  
Station Forest Inventory and  
Analysis Unit**

# Forest Inventory and Analysis Unit

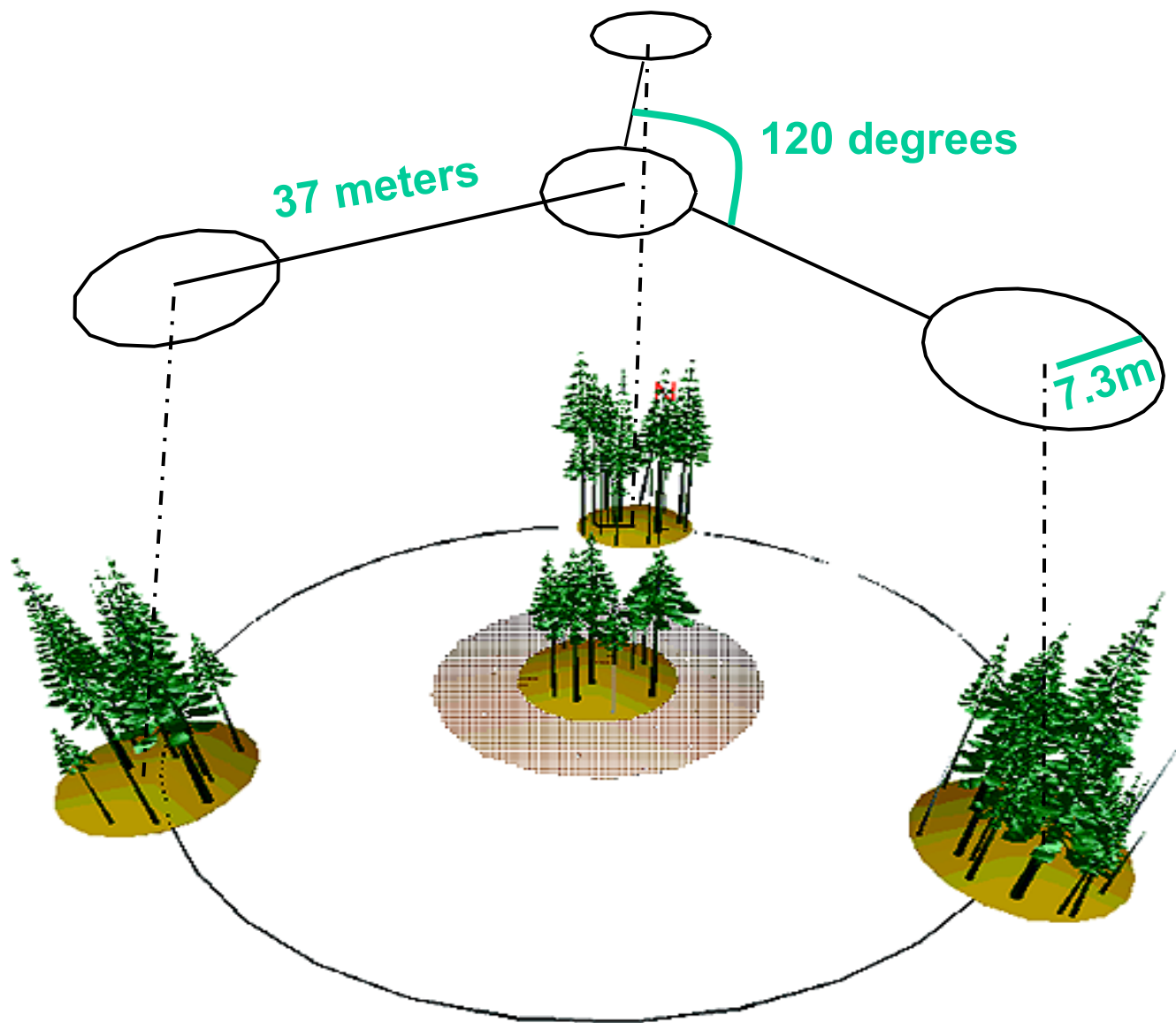
**Mission:** To improve the *understanding and stewardship* of the nation's forests through *scientifically credible inventories* and analyses of the *status and trends* in forest condition, use and productivity, and by transferring timely resource information and new technology to the public.

This is achieved through *annual inventories* of the nation's forest resources, *analysis* of the inventory data, and *distribution of inventory results*.



**Inventory Results Table:**

County	Volume	Ownership	Species Group	Biomass	Mortality	Ingrowth	Harvest	Change
1	14371	56730.39012	Oak	79605.96412	31306.28131	80121.40539	93455.01459	42831.01747
2	38948	64555.30212	Beech	12240.13443	31492.96588	13550.57375	1317.498007	60280.63085
3	31447	37208.29333	White Pine	99570.88063	6751.389567	26529.63796	68707.08833	93447.19781
4	64131	66062.35044	Red Spruce	98333.99503	59297.8659	85473.72362	58572.41038	60775.01106
5	54821	92516.30229	Birch	47001.81348	25942.92834	6631.936019	53376.34456	30212.58686

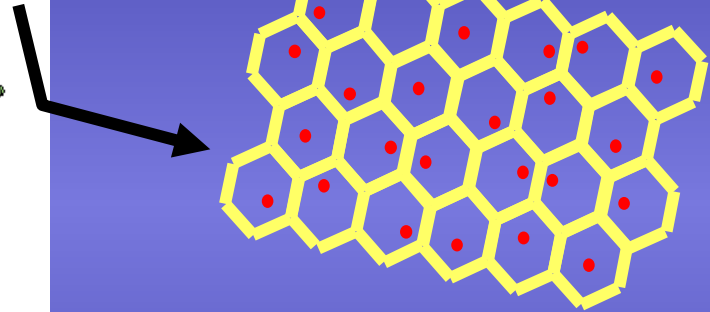
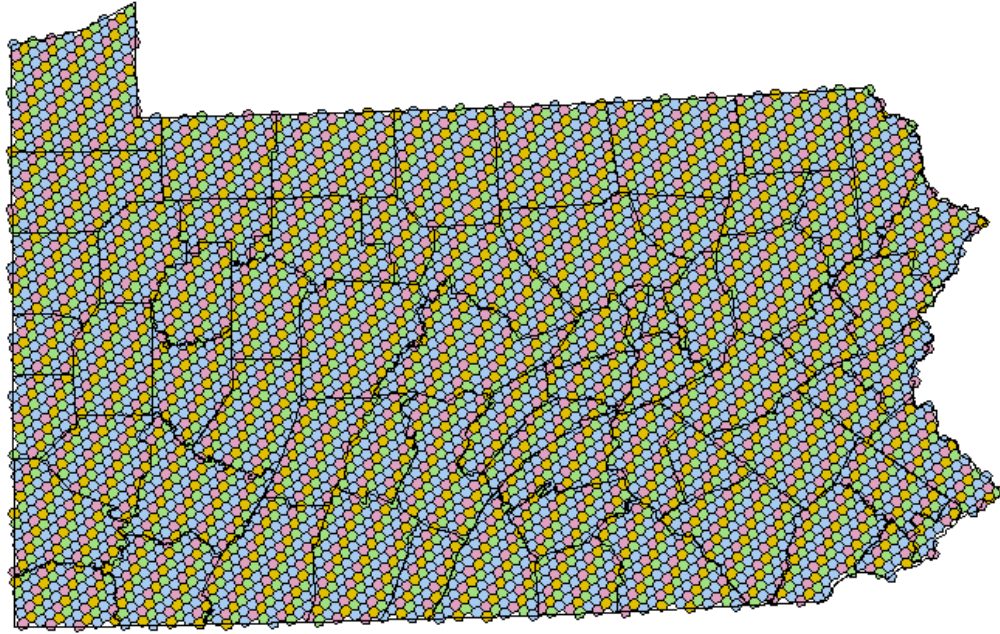


Four 0.02-ha subplots

### Tree and Site Variables:

- X,Y (of plot+trees)
- Tree height
- Tree diameter
- Species
- Regeneration
- Stand age
- Forest type
- Cover and Use
- Geomorphology
- Ownership
- ....

# FIA Sample Plot Distribution



Sample Intensity = 1 sample location  
per hexagon (2400 ha), ~5 km average spacing

Inventory Cycle Length = 5-10 years

**>300,000 plots at full implementation!!**

# FIA production line is institutionalized...

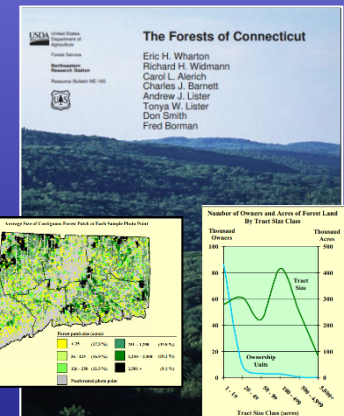


**Field Work**



- **Information Management**
- **Analysis**
- **Techniques Research**

**Reports  
and other  
products**



# Field Work – Remote sensing inputs

All plots

Only plots  
with forest

- Prescreen plots with NAIP, only visit when  $p(\text{forest}) > 0$
- Saves time and money

Time 1

Time 2

## Image-based Change Estimation:

- Cover, use and change with PI
- Point grid, 0.4-ha area
- Mid-cycle updates
- Landscape-level view

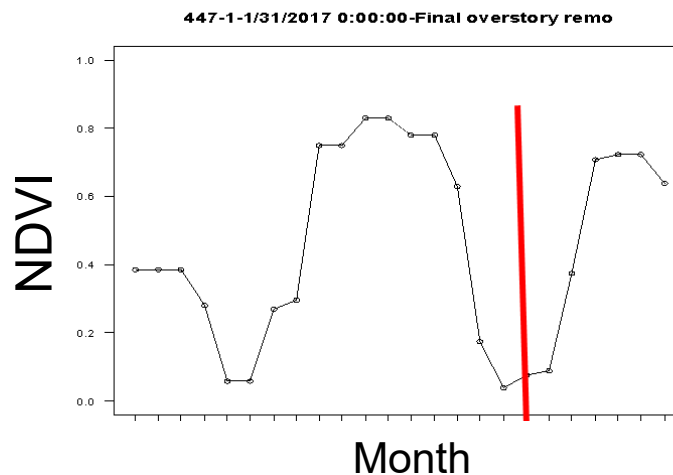
# Field Work – NASA can help

## Improvements to high-res imagery, LiDAR

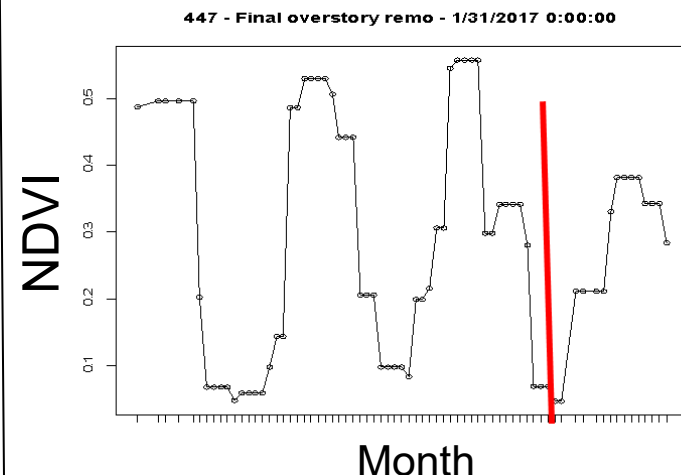
- automated  $p(\text{tree})$  calculation on high-res images
- segmentation tools/algorithms/ready-made products
- 3d products for decision support
- cloud-based display and processing
- High-res time series support tools, ARD



**Sentinel**



**Landsat 8**



# Information Management, Techniques Research and Analysis—Remote Sensing Inputs

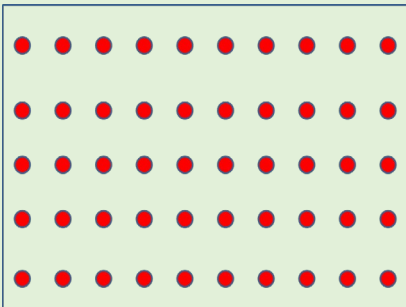
- Model-assisted estimation (post-stratification)
- Inputs for spatial modelling
- Additional data products to add context to plot data

# Post Stratification

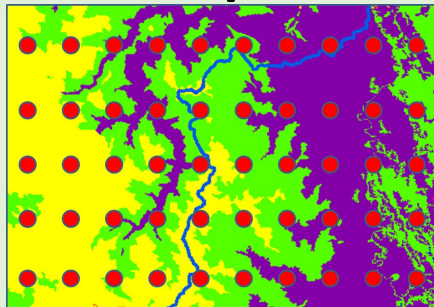
Post-Stratification: Using an attribute on a map to group and weight estimates after (post) the sample on the ground is taken.

**Goal: confidence interval with stratification smaller than CI without stratification**

Step 1



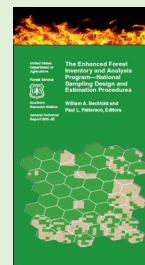
Step 2



Step 3

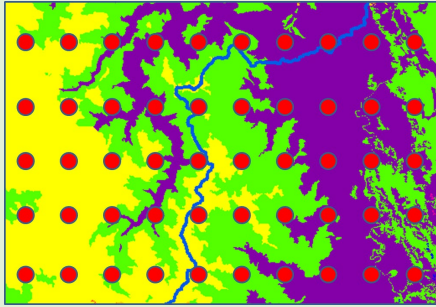
$$\hat{A}_d = A_T \sum_h^H W_h \overline{P}_{hd} = A_T \overline{P}_d$$

$$v(\hat{A}_d) = \frac{A_T^2}{n} \left[ \sum_h^H W_h n_h v(\overline{P}_{hd}) + \sum_h^H (1 - W_h) \frac{n_h}{n} v(\overline{P}_{hd}) \right]$$



[http://www.srs.fs.usda.gov/pubs/gtr/gtr\\_srs080/gtr\\_srs080.pdf](http://www.srs.fs.usda.gov/pubs/gtr/gtr_srs080/gtr_srs080.pdf)

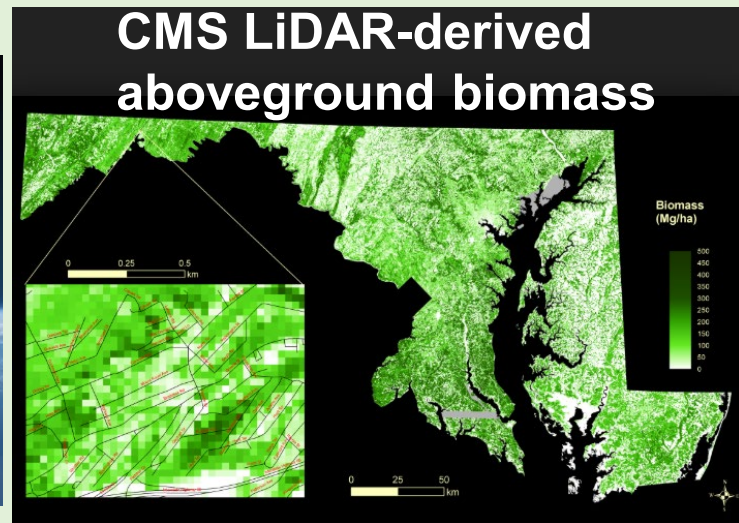
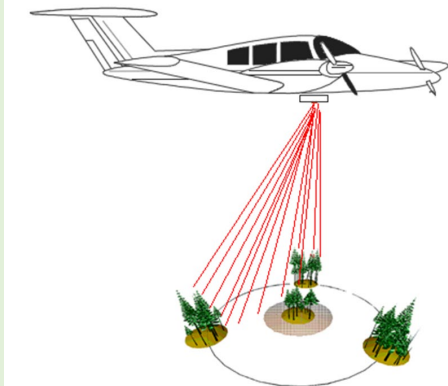
# Currently:



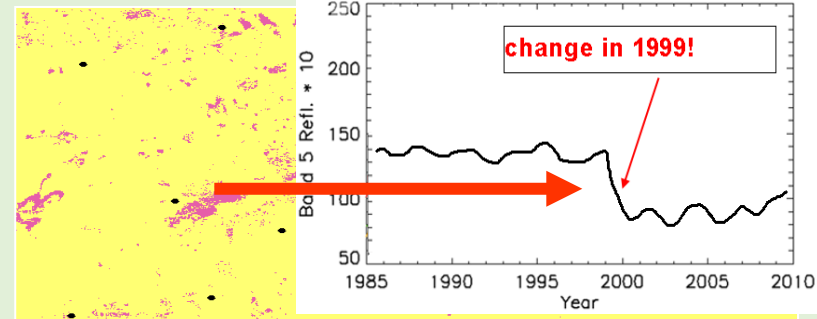
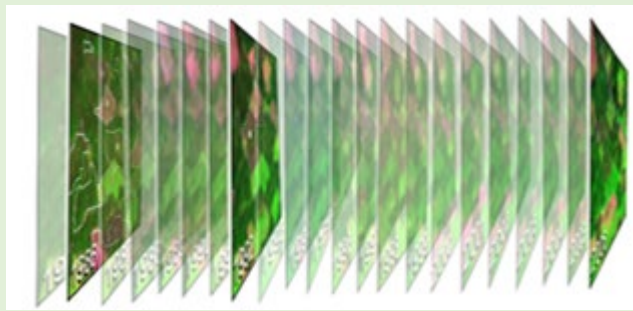
National Land Cover Dataset Canopy  
Cover products (2011, 2016),  
discretised into strata

## With NASA's partnership:

Lidar-derived tree heights

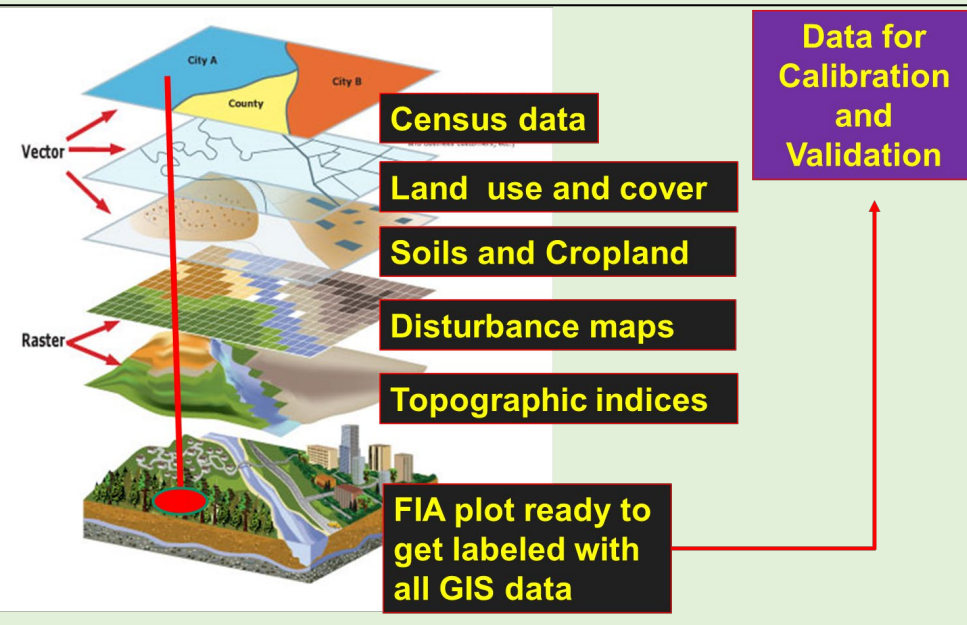


Change maps for  
better estimation  
of change:

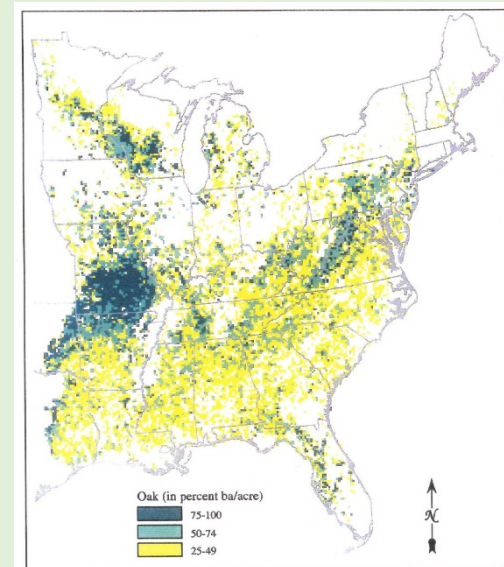
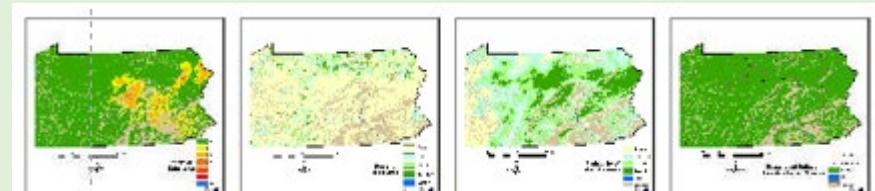


# Inputs for spatial modelling

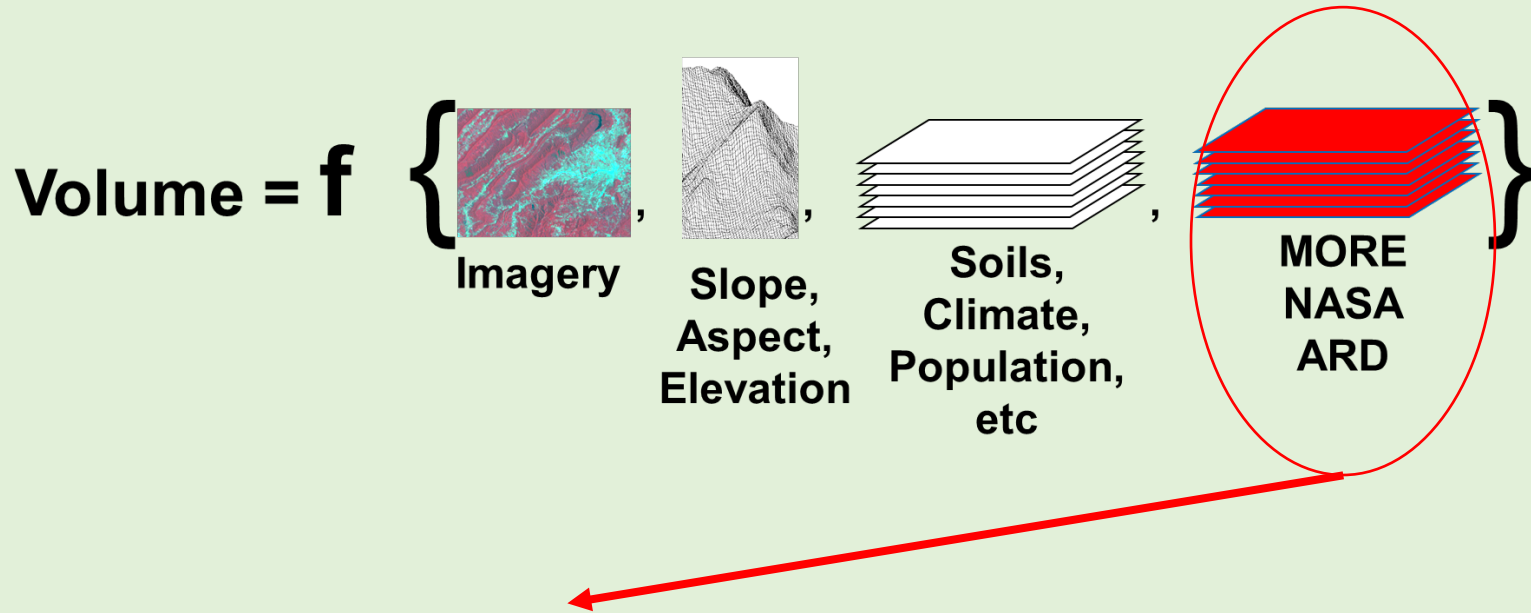
$$\text{Volume} = f\left\{ \begin{array}{l} \text{Imagery} \\ \text{Slope, Aspect, Elevation} \\ \text{Soils, Climate, Population, etc} \end{array} \right\}$$



## Modeled maps of FIA attributes



# Inputs for spatial modelling – from NASA



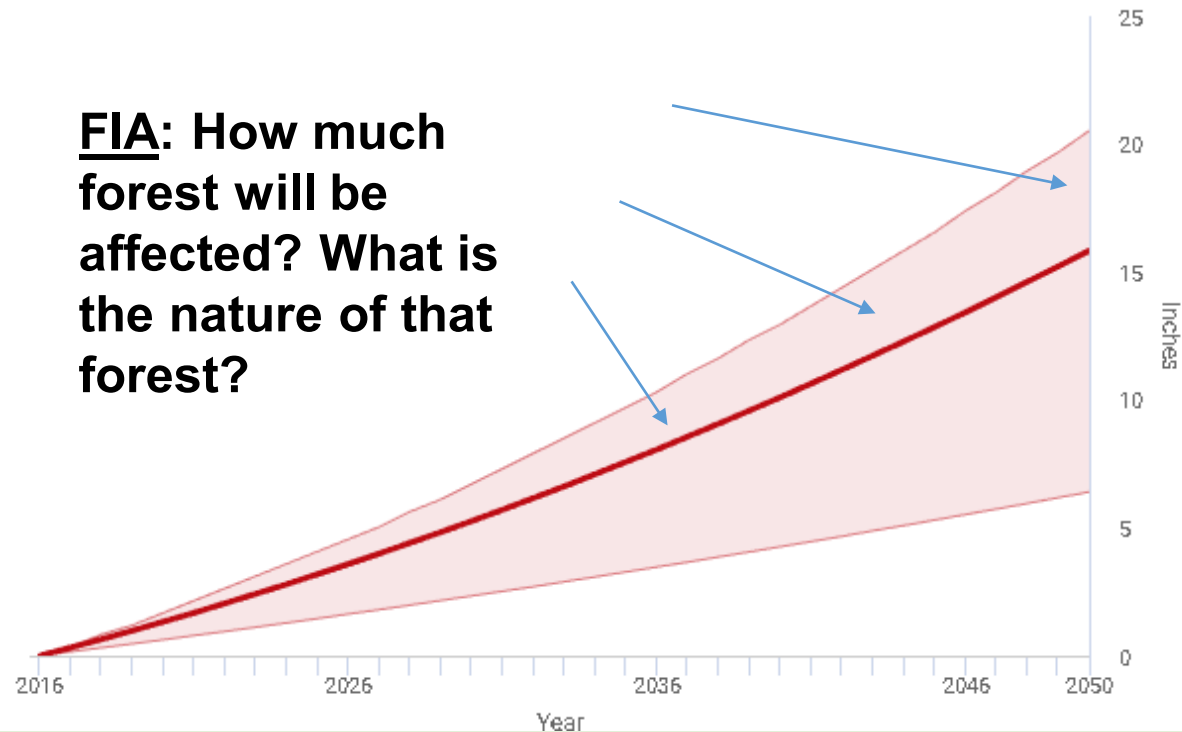
- **Cloud-based ARD as raster/ArcGIS server, GEE assets**
- **Cloud-based processing tools like AppEEARS (but with full Landsat and Sentinel records)**
- **Higher resolution products/algorithms**

# Additional data products to add context



## NASA: Bridgeport Sea Level Rise Forecasts

FIA: How much forest will be affected? What is the nature of that forest?



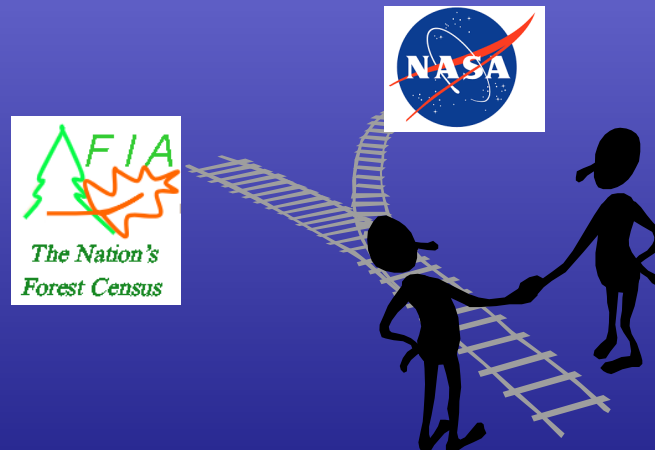
- Climate change scenario maps
- Risk models and maps
- Urbanization predictions
- Weather/Soil Moisture data



**All help us put  
FIA results into  
context**

# Summary

1. FIA is a well-oiled machine, for good and for bad.
2. Remote sensing products are used operationally, and can be improved by NASA products.
3. We like to do our own modelling, so ARD and cloud support and time series analysis tools are most helpful.
4. Together we can brainstorm what products can help us better deliver our missions.



Questions?  
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