



Assessment of North American Industrial Forests

Disturbances, Biomass Extraction

Growth Vigor

Chengquan Huang¹, Feng Aron Zhao¹, Xin Tao¹, Ming Feng¹, Pui-Yu Ling¹, Samuel Goward¹,
Karen Schleeweis², Matthew Hansen¹, Peter Potapov¹, Jennifer Dungan³,
Andrew Michaelis³, Matthew Fagon⁴, Jeff Masek⁵,
Ramakrishna Nemani³, Michael Wulder⁶

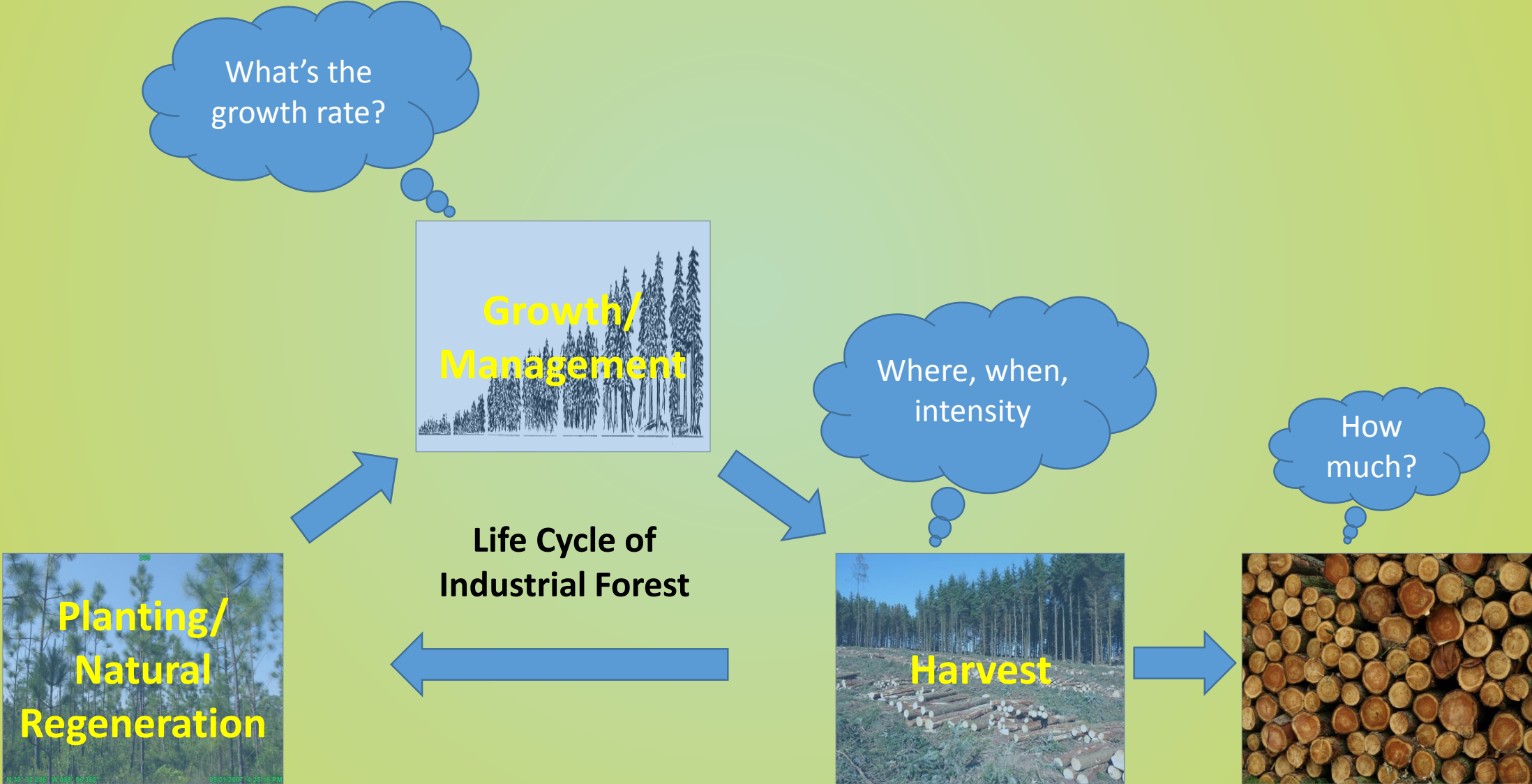
¹ Department of Geographical Sciences, University of Maryland; ² USDA Forest Service, Rocky Mountain Research Station; ³ NASA Ames Research Center; ⁴ University of Maryland Baltimore County; ⁵ NASA Goddard Space Flight Center; ⁶ Canadian Forest Service

We Need Industrial Forests, But ...

- Societal benefits:
 - Wood Products, Timber supply
 - Reduce cutting of natural forests
 - Carbon sequestration
- Environmental impact
 - Mono-species
 - Not much structure variability
 - Rarely become old growth
 - Intensive management
 - Negative impact on soil, water, biodiversity

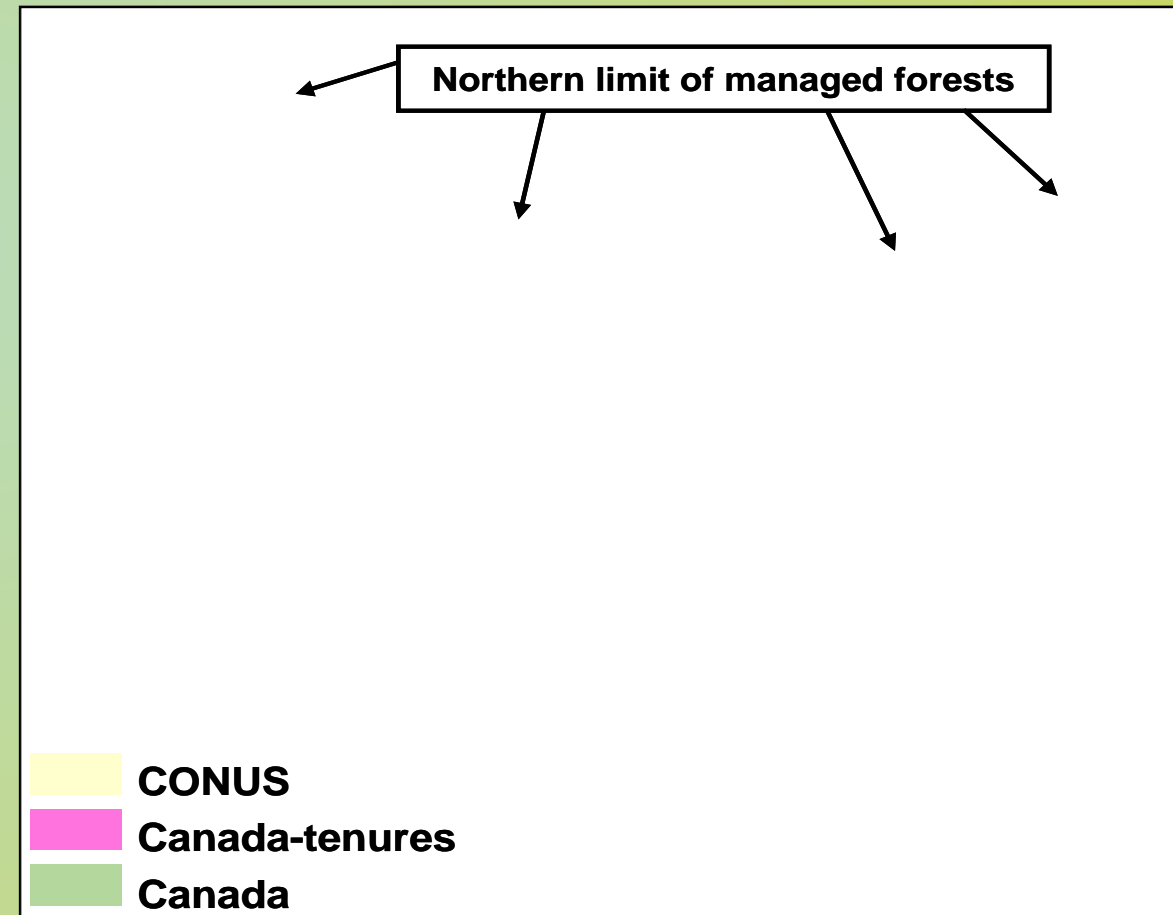


Key Assessment Questions



Study Area

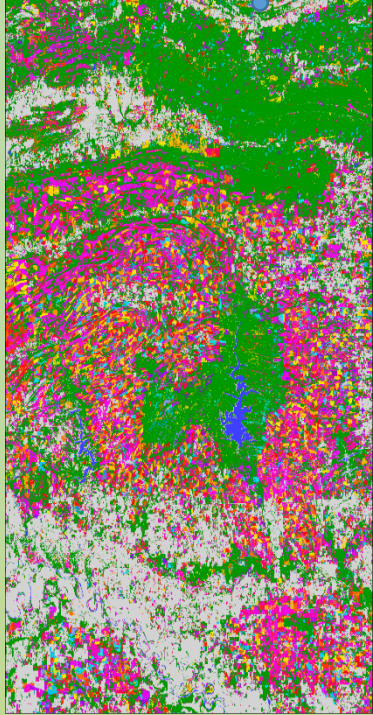
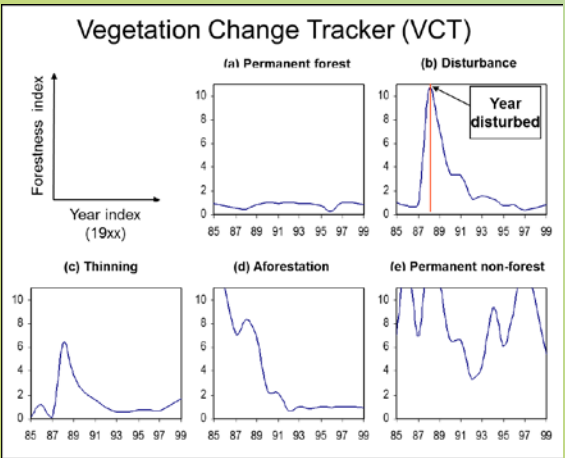
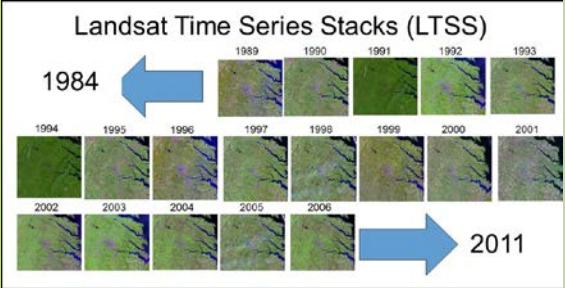
- US
 - Private land
 - Some public land subject to industrial logging (e.g., national forest)
- Canada: timber tenure



Overall Approach

Where, when, intensity

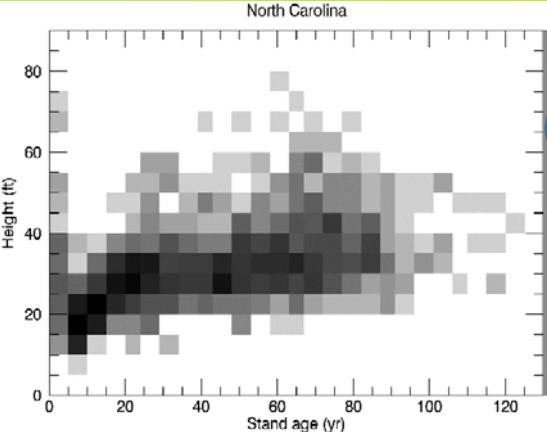
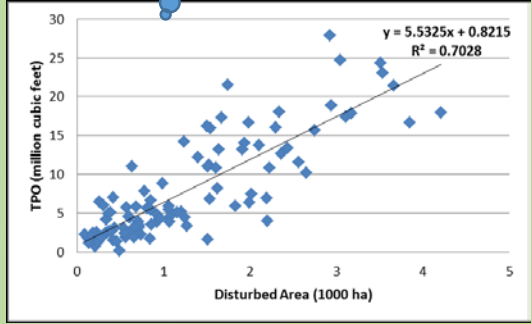
How much?



Attribution

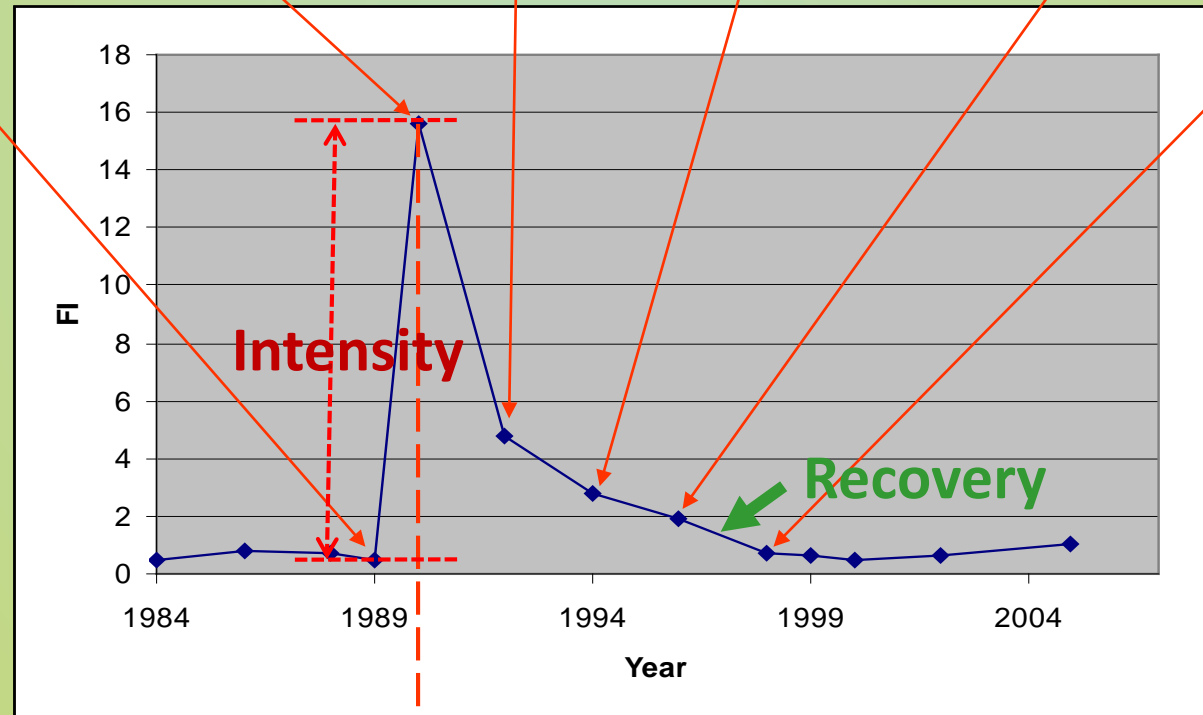
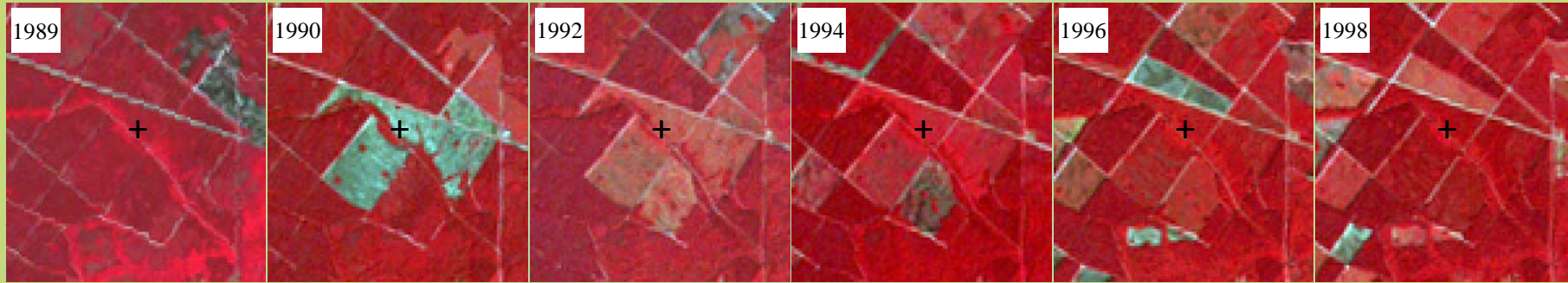
TPO

FIA
Field data



What's the growth rate?

Vegetation Change Tracker (VCT)



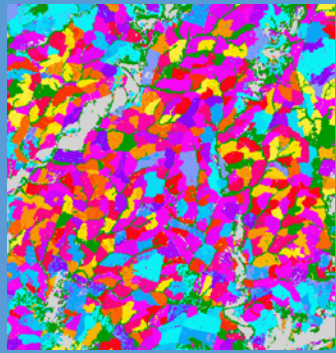
Major Outputs:

- Disturbance year
- Disturbance intensity
- Whether and when growth back

Year of disturbance

(Huang et al., 2010)

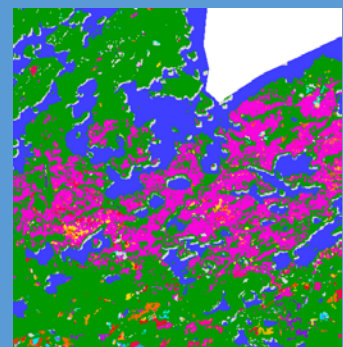
Little left undisturbed



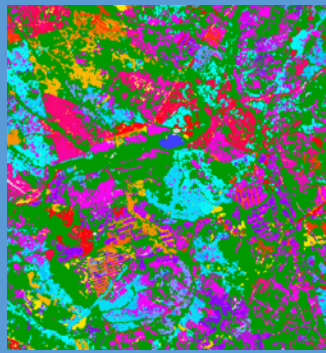
Whole Island burned



Severe wind blow-down

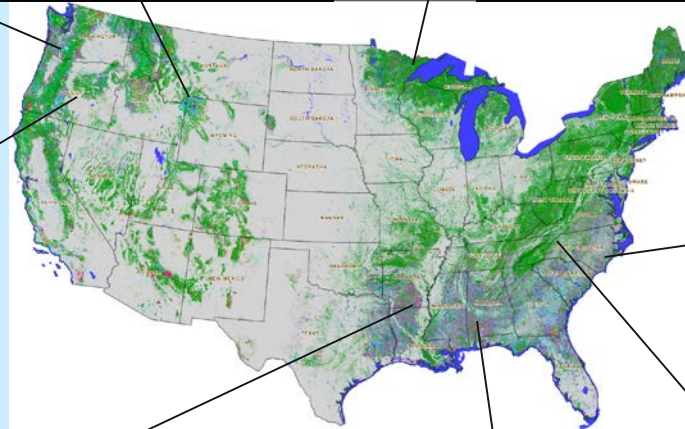
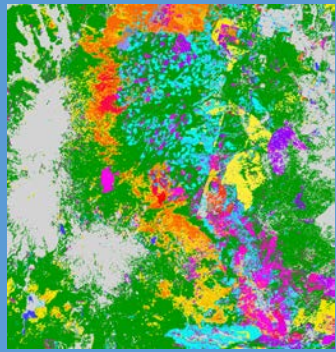


Logging industry

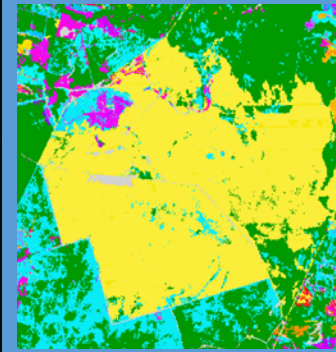


This NAFD-NEX product is distributed through ORNL DAAC.

Fires and insects



Lightning induced fire

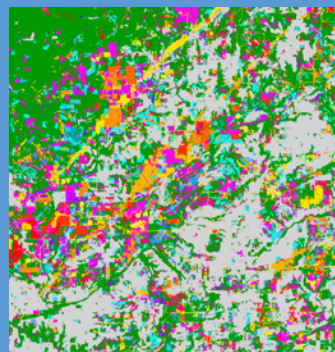


No change classes

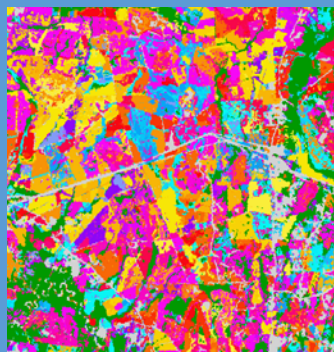
- Persisting Nonforest
- Persisting Forest
- water

Disturbance year classes

- Pre-observation
- 1985
- 1986
- 1987
- 1988
- 1989
- 1990
- 1991
- 1992
- 1993
- 1994
- 1995
- 1996
- 1997
- 1998
- 1999
- 2000
- 2001
- 2002
- 2003
- 2004
- 2005
- 2006
- 2007
- 2008
- 2009
- 2010
- 2011

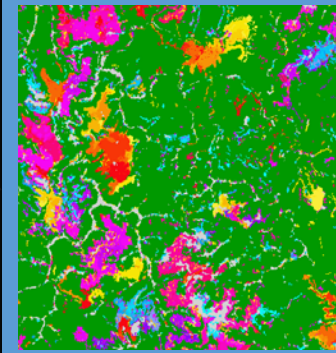


Parallel tornados tracks



Intensive logging

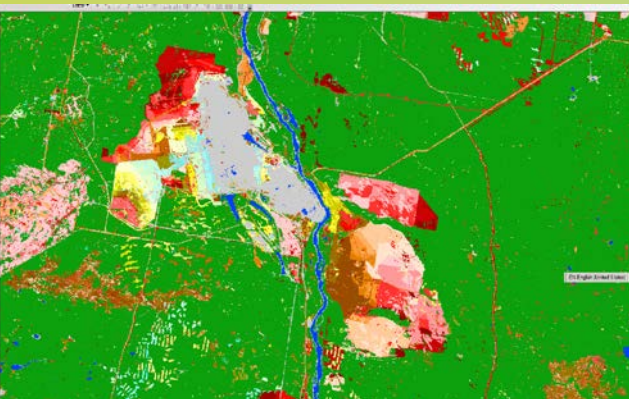
Mountain top mining



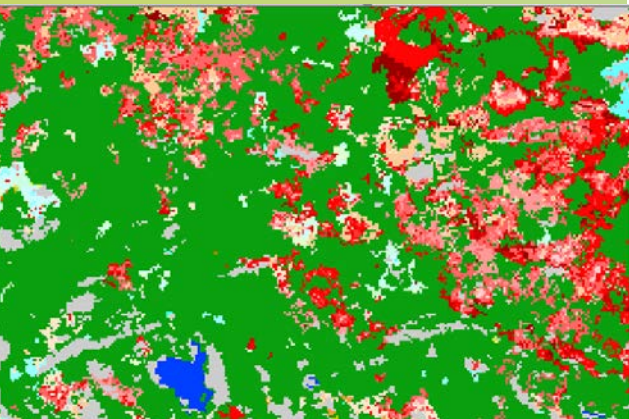
A Quarter Century History of US Forest Disturbances – NAFD-NEX Disturbance Product

US-Canada Forest Disturbance History Map

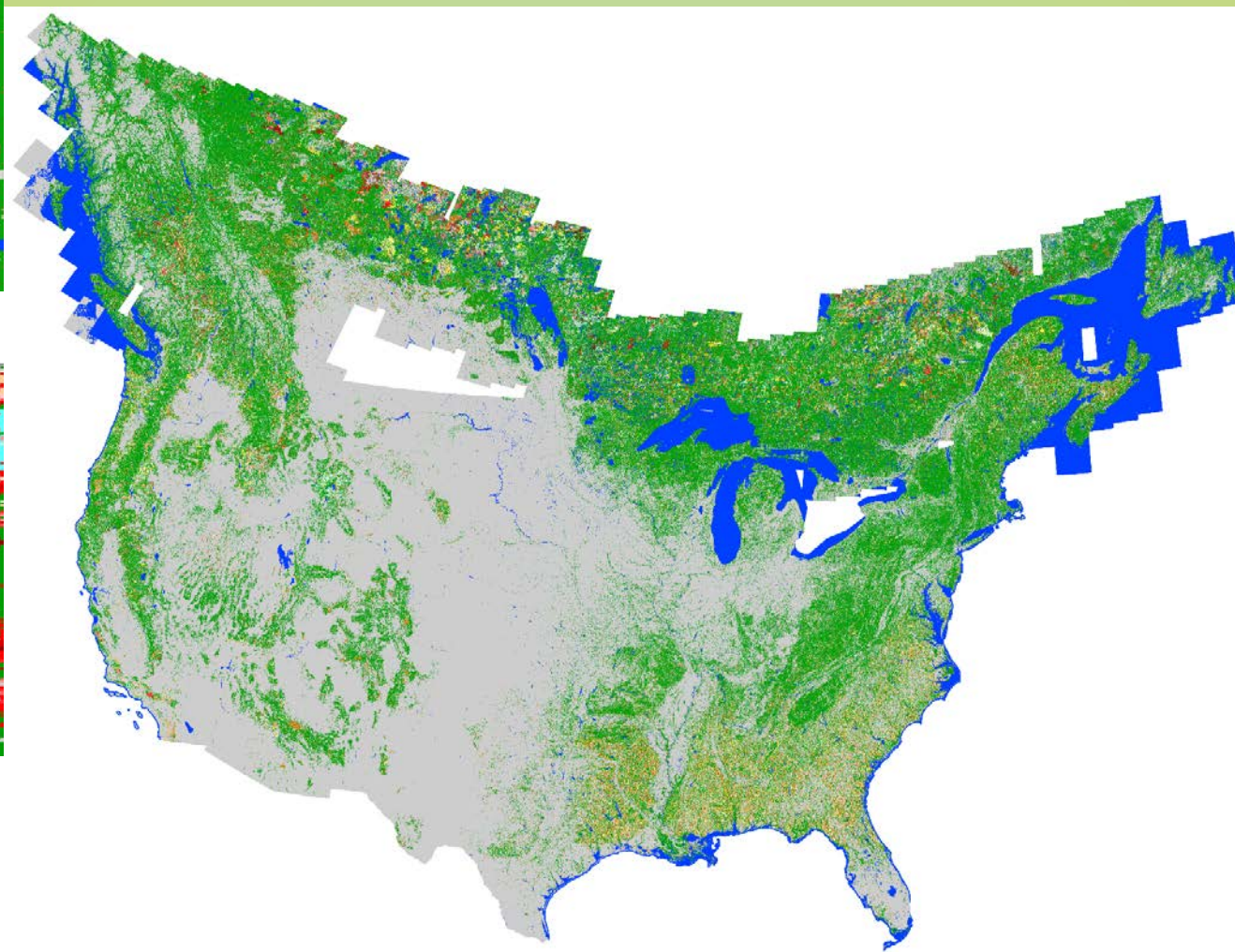
Sand oil exploration



Beetle damage and salvage logging

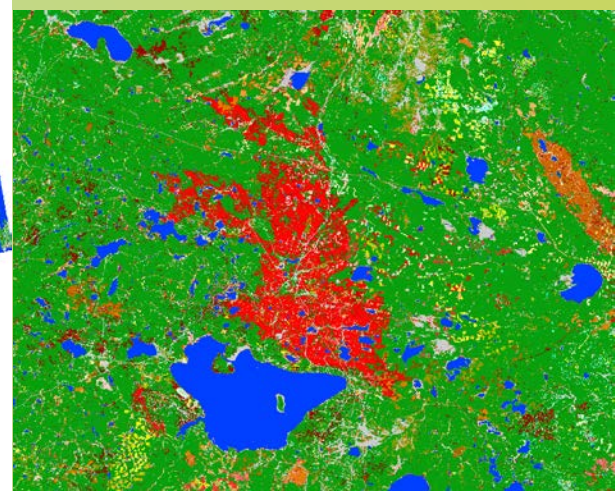


Urbanization

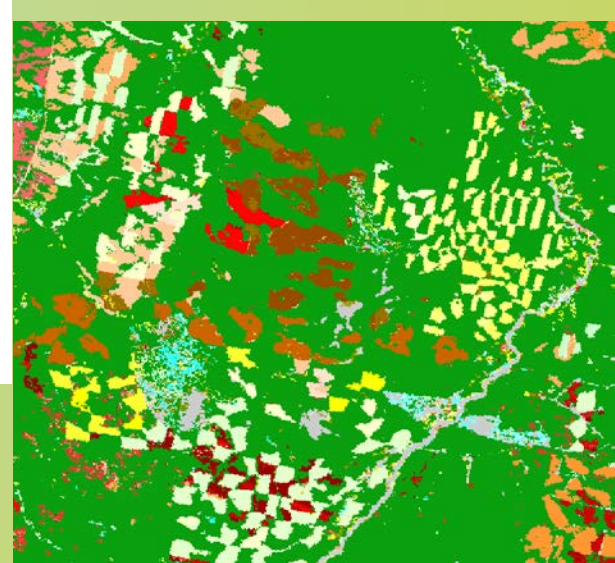


Unclassified	1985	1990	1995	2000	2005	2010
Persisting Nonforested	1986	1991	1996	2001	2006	2011
Persisting Forest	1987	1992	1997	2002	2007	2012
Water	1988	1993	1998	2003	2008	2013
Pre-1985	1989	1994	1999	2004	2009	2014

Fire



Harvest

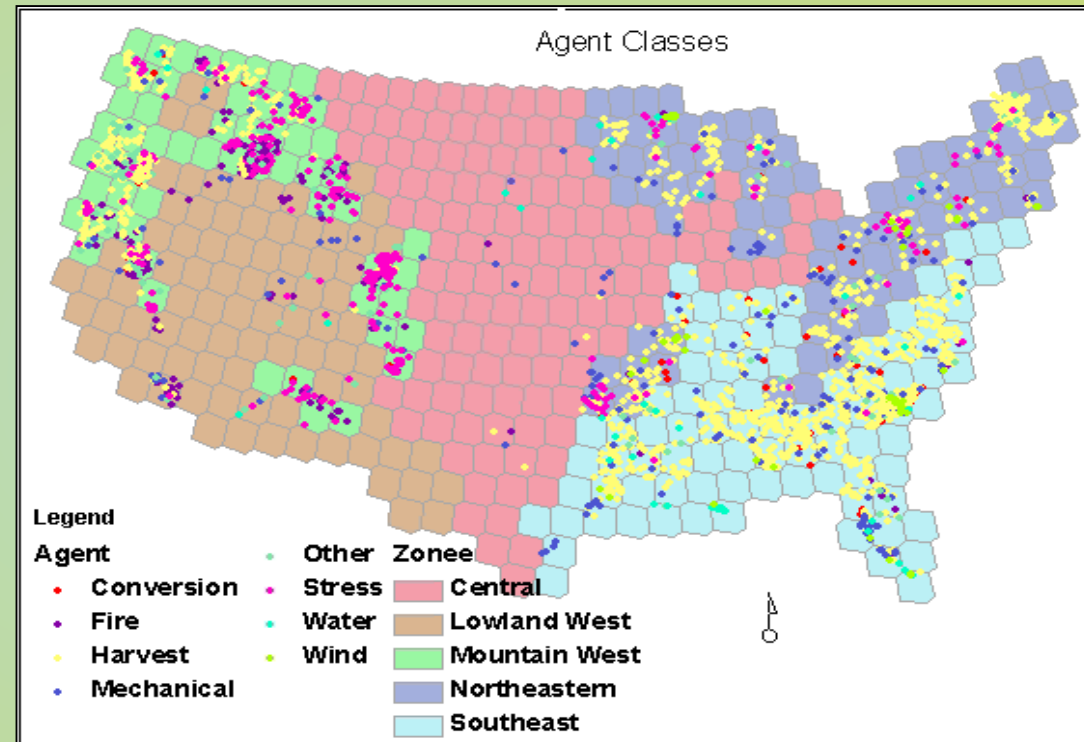


Attribution – Training Data

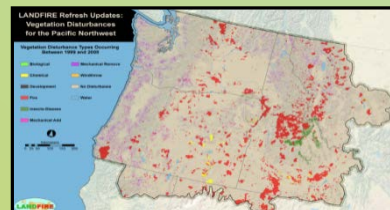
Probabilistic Sampling Design - 2 stage stratified random cluster

Response Classes:

- Harvest
- Wind
- Fire
- Stress *
- Conversion
- Other

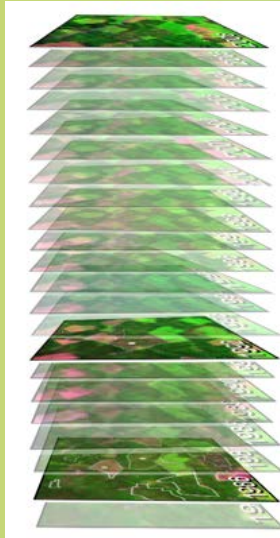


- 7200 plots
- $30\% \text{ FC} * 1.5\% \text{-yr} * 25 \text{ yrs} \sim 800 \text{ DF}$, but we got 1438 DF plots (Cohen et al. 2016)
- augmented with 560 disturbance plots from Pilot study



Attribution – Predictor Variables

Multiple Landsat time-series change algorithms:

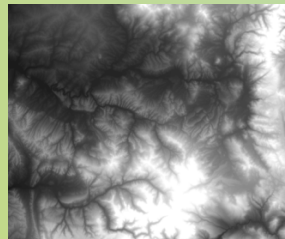


VCT (Huang et al 2010)

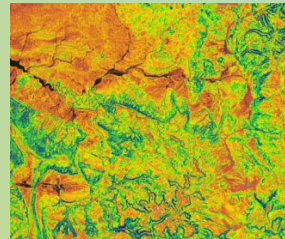
Shape-restricted splines (Meyer 2008, 2012)

MTBS (P/A)

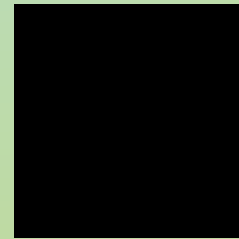
Elevation



Slope



Cos Aspect



TOPOGRAPHY

DISTANCE TO:

- Roads, Navigable Waterways,
- Areas of housing density increases (Theobald 2004),
- ADS confidence/severity (Schleeweis 2013),
- Tornadoes tracks (NOAA)
- Hurricanes tracks (NOAA)

MAGNITUDE :

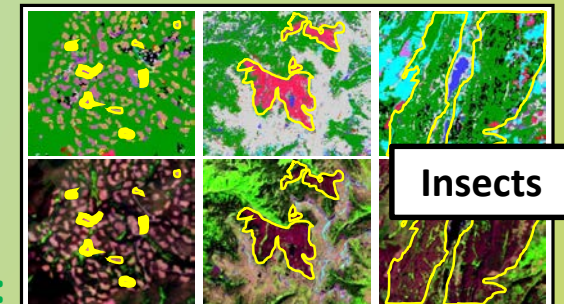
VCT – FI,NDVI, B5, NBR
Shapes – FI,NDVI,B5,NBR

TEMPORAL PATTERNS:

VCT- year, frequency,
Shapes FI,NDVI,B5,NBR–
duration, pre-rate, Post-rate,

Spatial pattern (VCT):

VCT - Area, perimeter,
shape index, fractal index



VEGETATION:

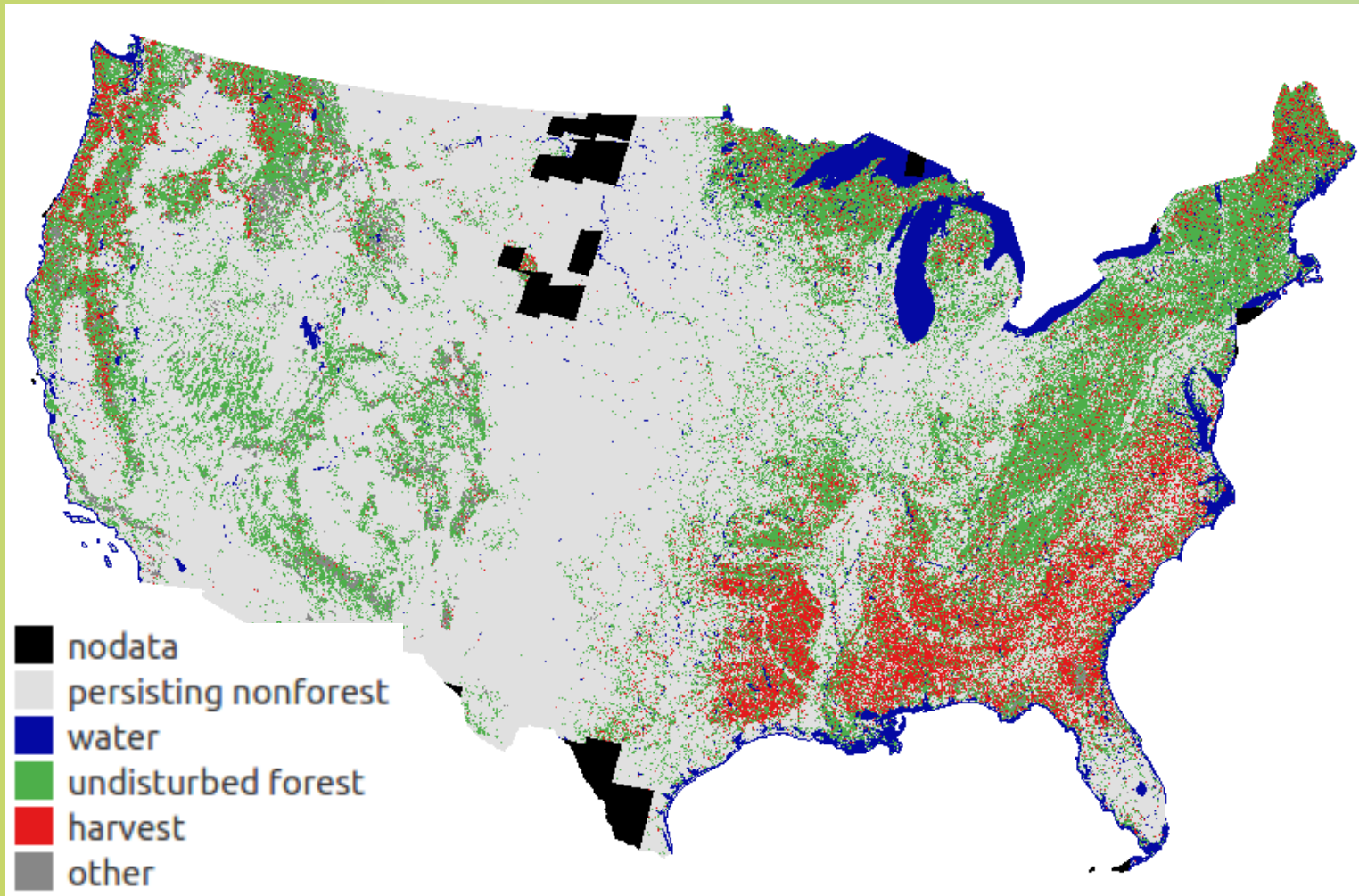
- Forest Probability (Blackard et al.)
- Forest Type Group (Ruefenacht et al.)

STATUS

- **GAP status**

(Schleeweis et al.)

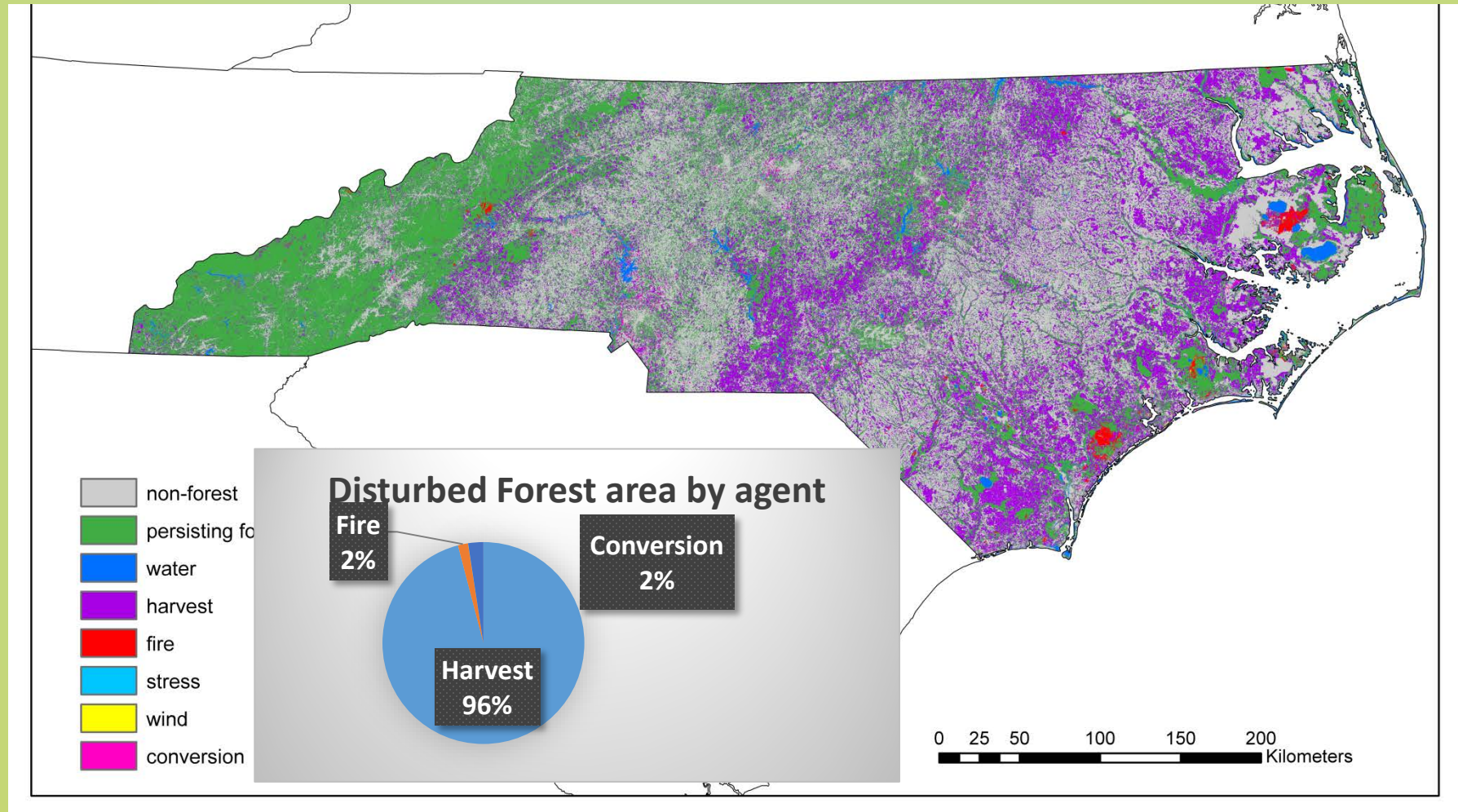
Preliminary US Forest Harvest Map



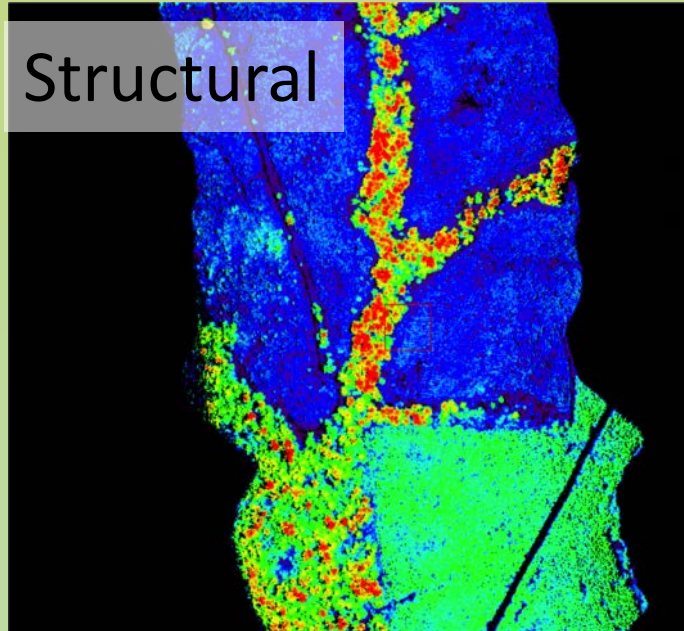
~25% of Forest land in CONUS
harvested 1985-2010

(Schleeweis et al.)

Satellite Observed Disturbance Dominated by Harvest in NC

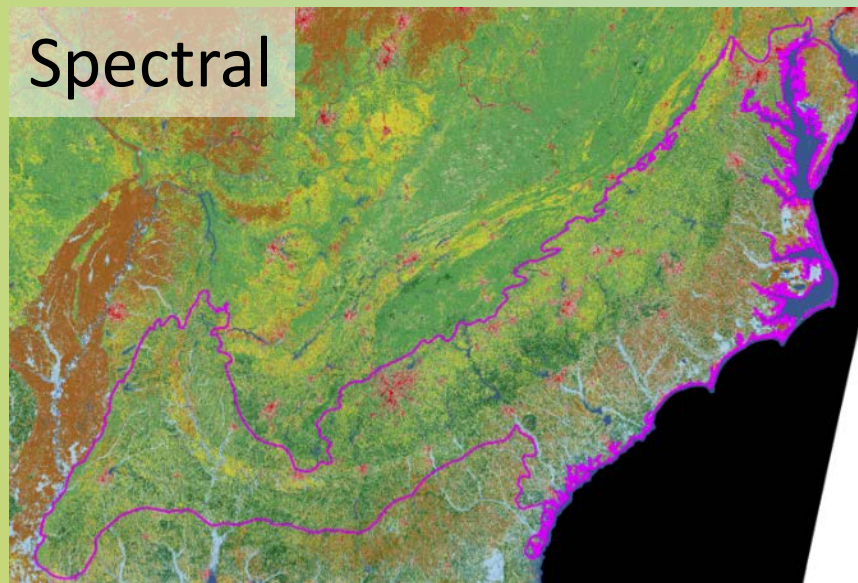


Methods: Mapping tree plantations



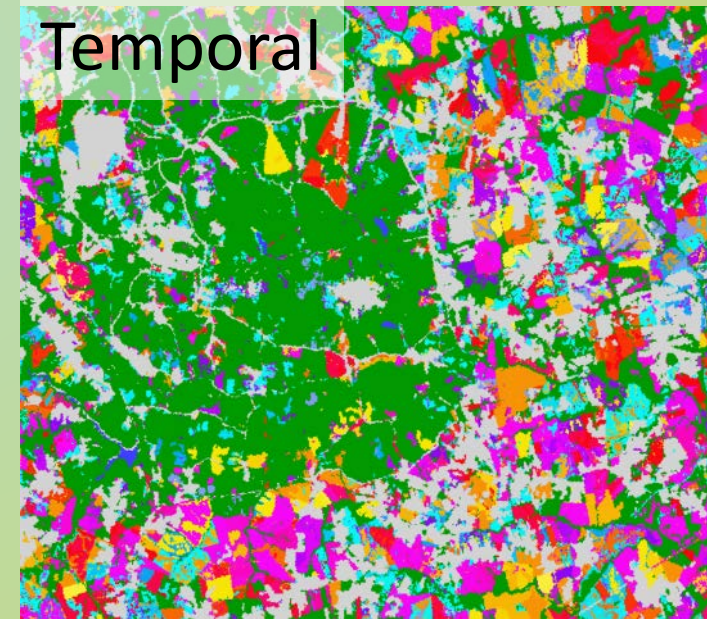
G-LiHT aerial LiDAR data
Metrics for 15 m bins

- Canopy variability
- Canopy shape
- Understory cover
- Forest cover



- National Land Cover Database (NLCD)
- NDVI (2011 summer-winter, texture)
- LiDAR reflectance

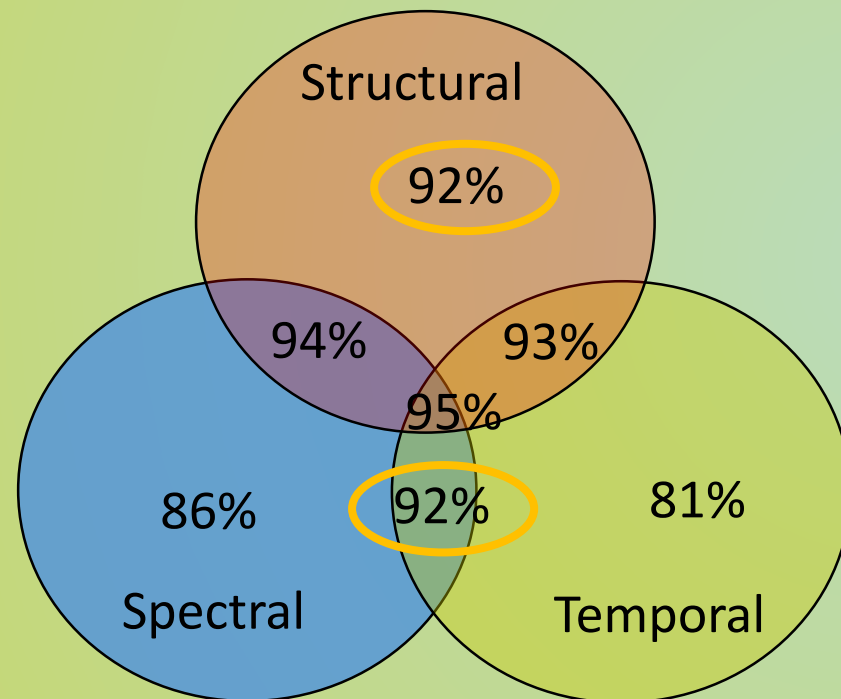
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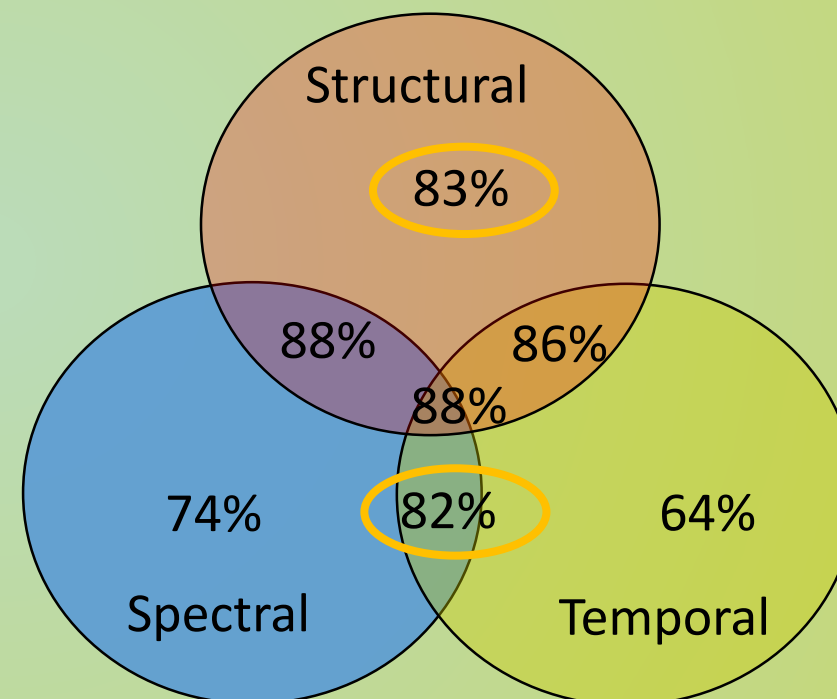
- Vegetation Change Tracker (VCT), 1985-2011
- Hansen Forest Change data, 2000-2013

LiDAR-derived structure is a key predictor, across the different classification models

Overall accuracy

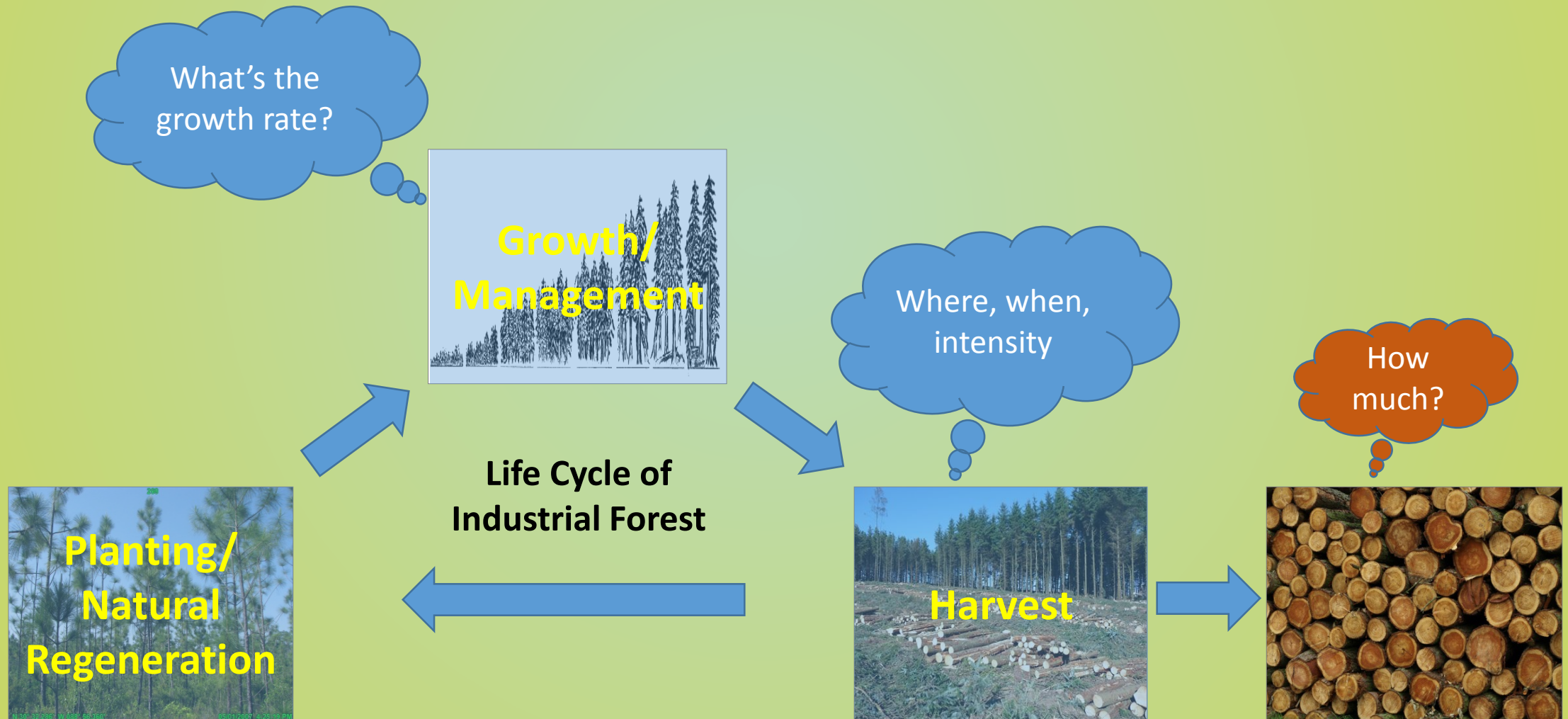


Pine plantation class accuracy

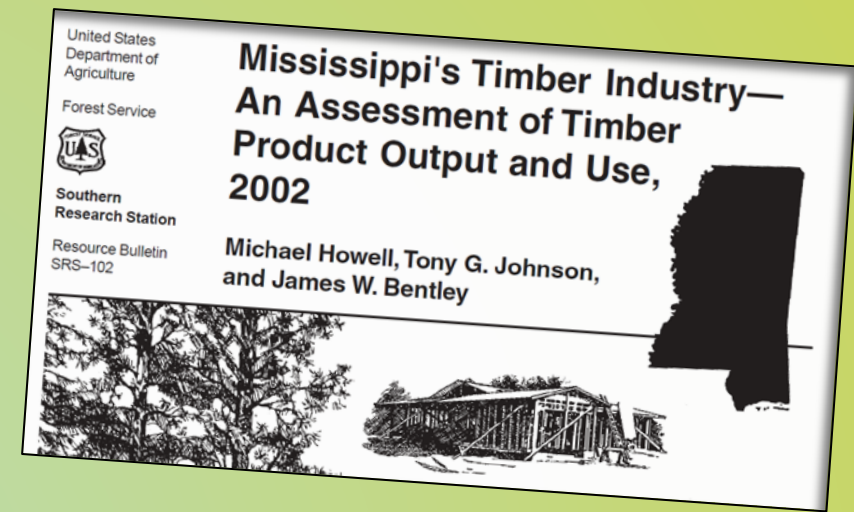


But the combination of spectral-temporal predictors is comparable!

Key Assessment Questions



Survey Based Timber Volume Estimates



Forest... x SRS TPO ... North Ca... Southern Stat... Southern Stat... Southern Stat... nasa Iclu... Welcome to L... Welcome to L...

www.fia.fs.fed.us/program-features/tpo/

USDA FOREST SERVICE Forest Service

Forest Inventory and Analysis National Program

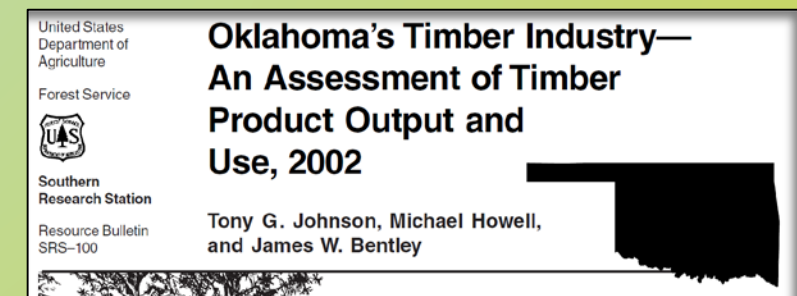
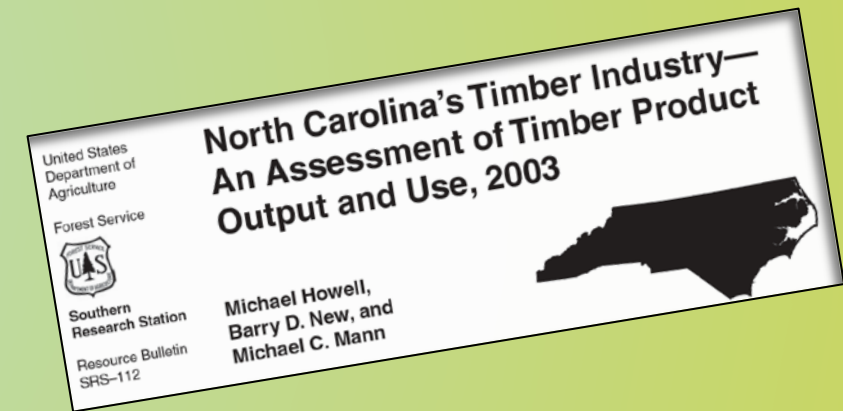

(enter query) Search

- U.S. Forest Service
- Forest Inventory & Analysis
- Regional Offices
- Program Features**
 - Basic Forest Inventory
 - Forest Health Indicators
 - Timber Products Output**

Program Features

Timber Products Output Studies

FIA conducts Timber Products Output (TPO) studies to estimate industrial and non-industrial uses of roundwood in a state. To estimate industrial uses of roundwood, all primary wood-using mills in



Availability of USFS TPO Data Limited & Inconsistent

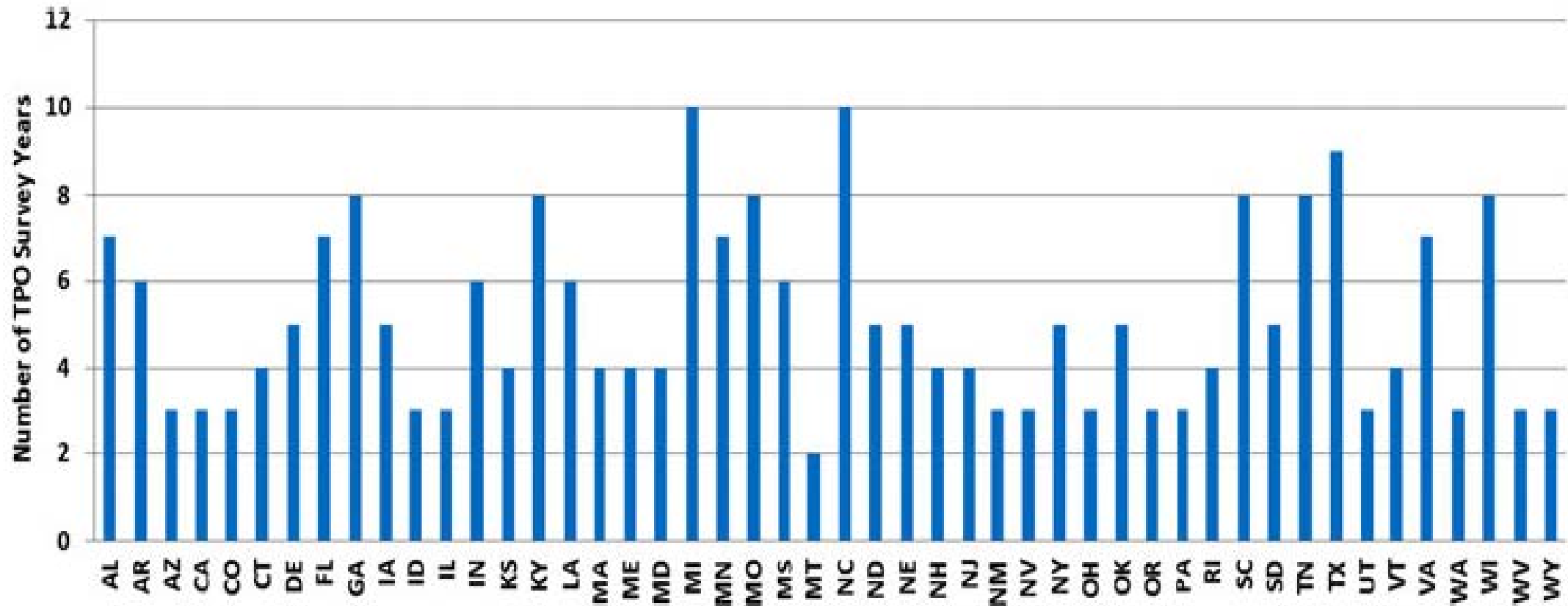
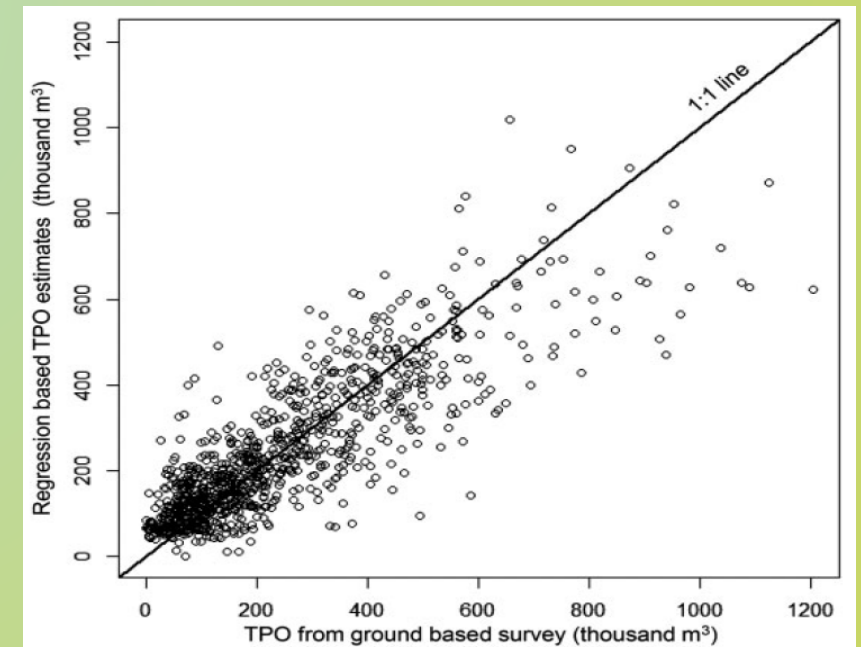
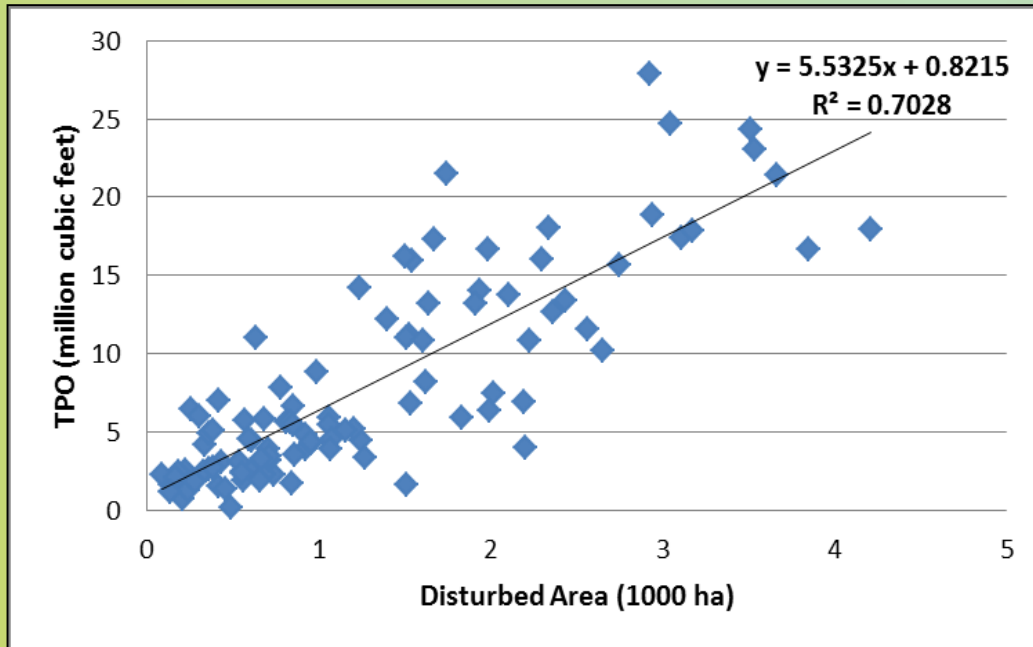


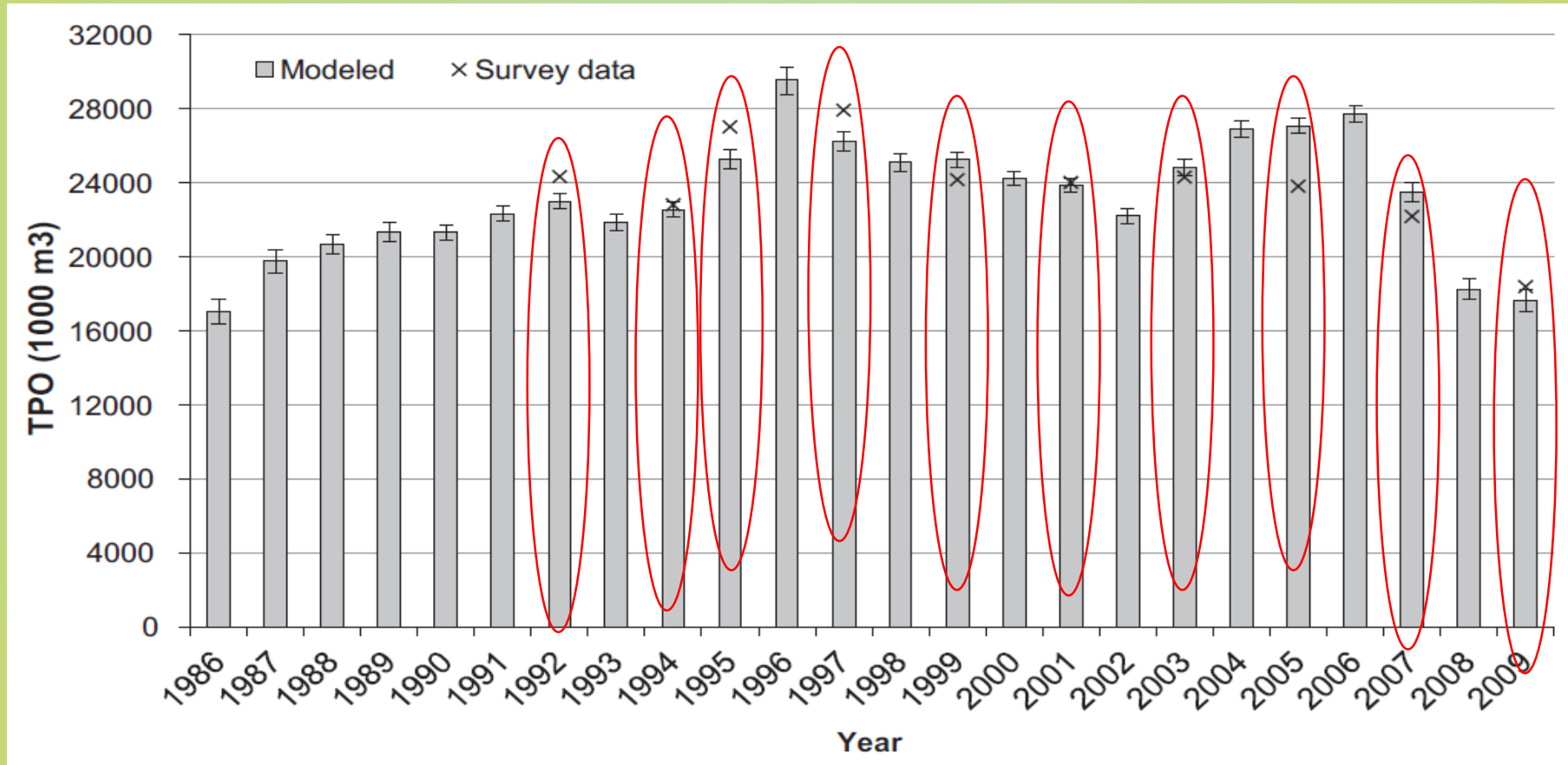
Figure 1. Number of years for which ground-based TPO survey data exist in the conterminous USA (updated as of June 2013).

Establish Annual TPO Record Using Landsat-Based Disturbance/Harvest History

- TPO correlated with disturbance data
 - Establish TPO-disturbance model based on available TPO survey data
 - Apply model to all years covered by disturbance data

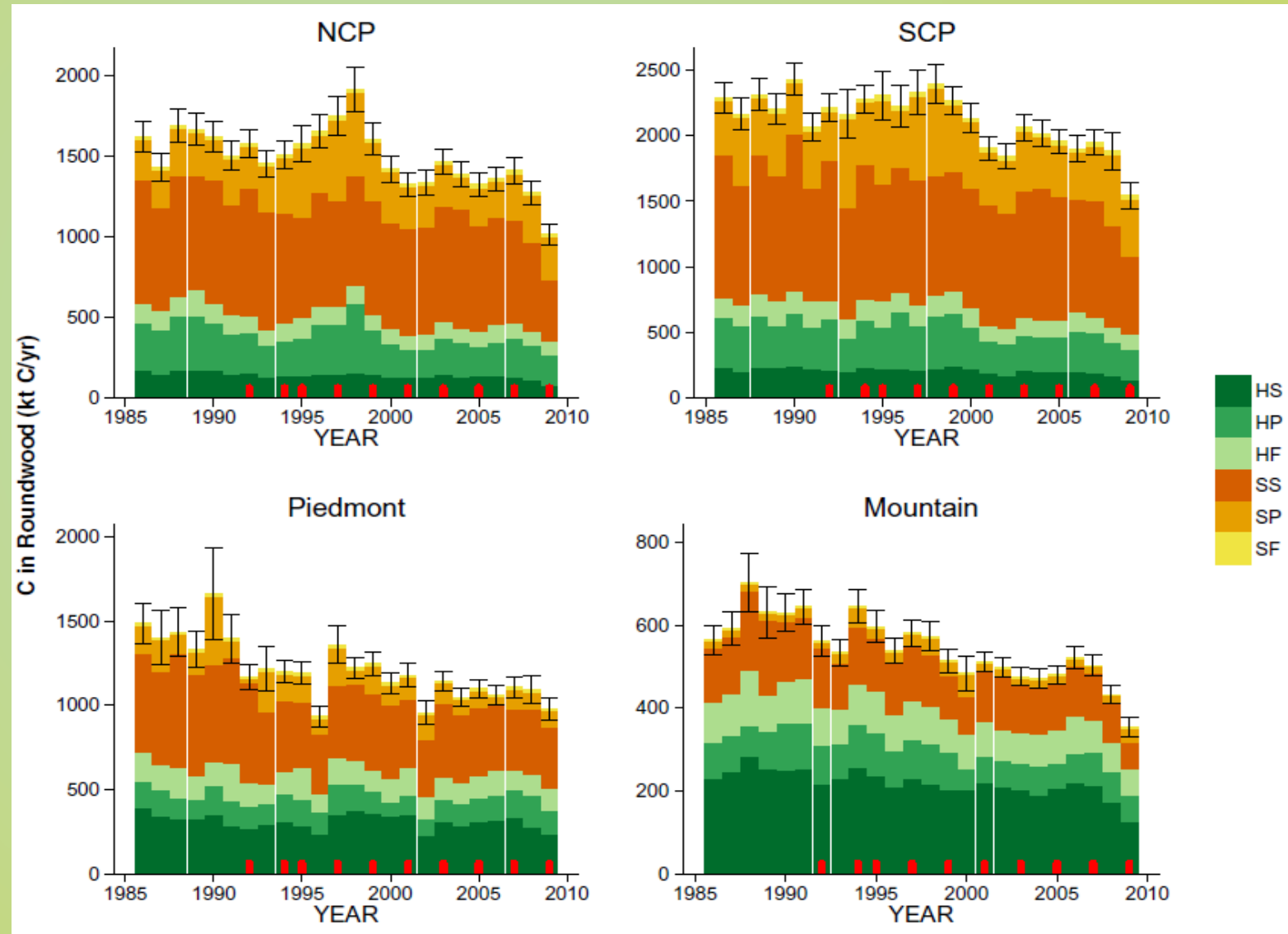


An Annual TPO Record for NC

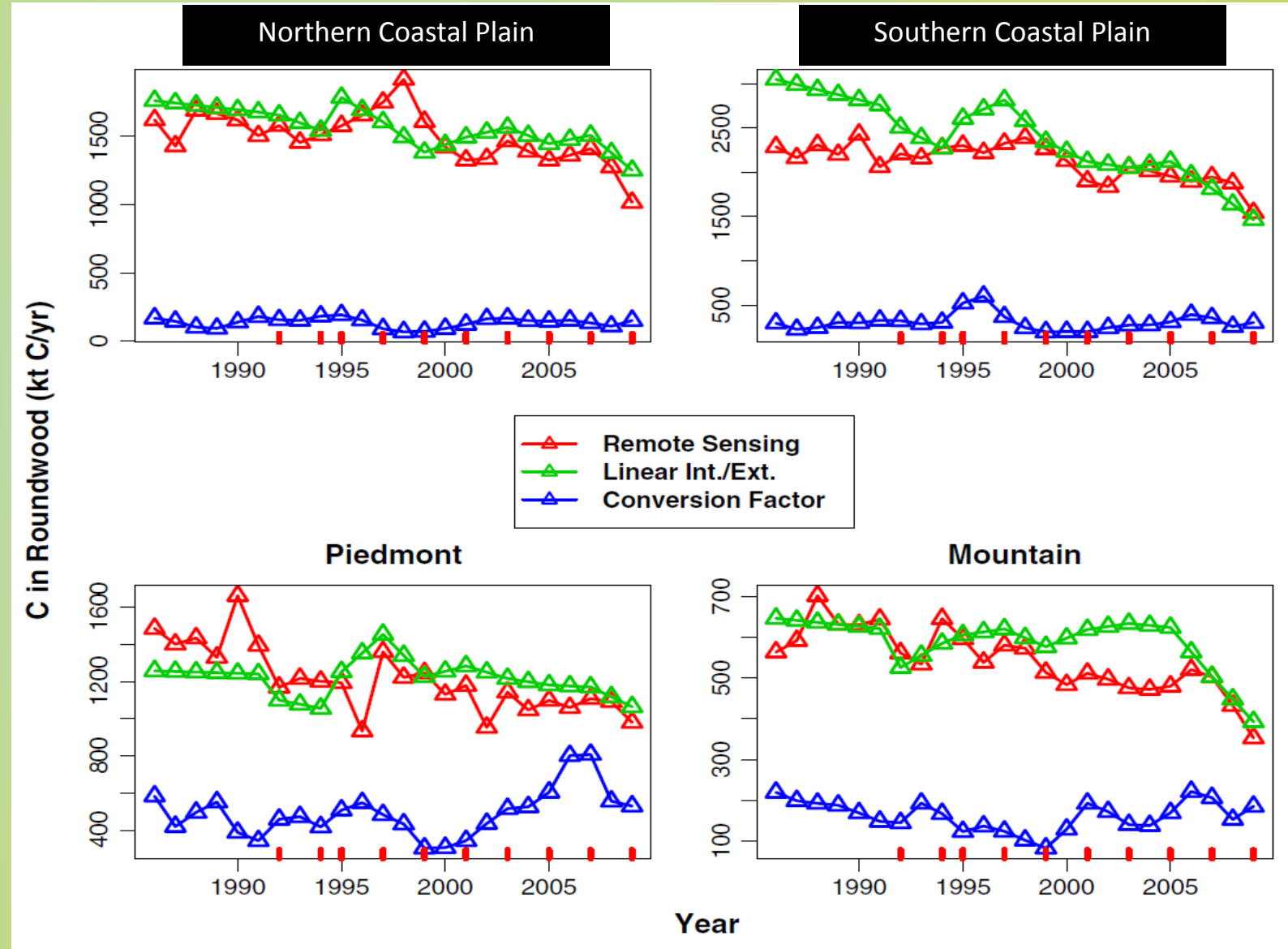


Huang, C., Ling, P.-Y. and Zhu, Z., 2015. North Carolina's forest disturbance and timber production assessed using time series Landsat observations. *International Journal of Digital Earth*, 1-23.

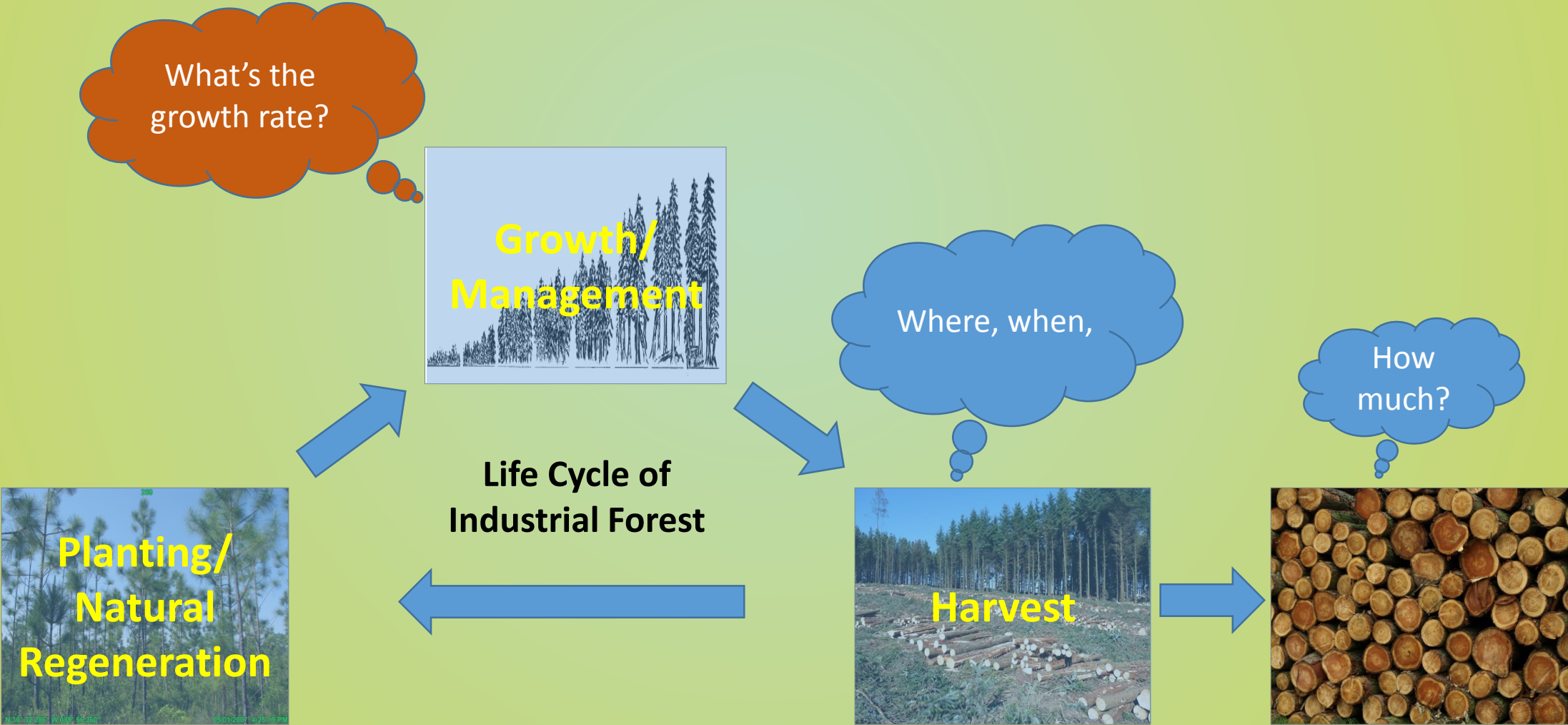
Estimation of C in Different Species of Wood Products



Disturbance-Based Estimate of C in Wood Products Likely More Realistic

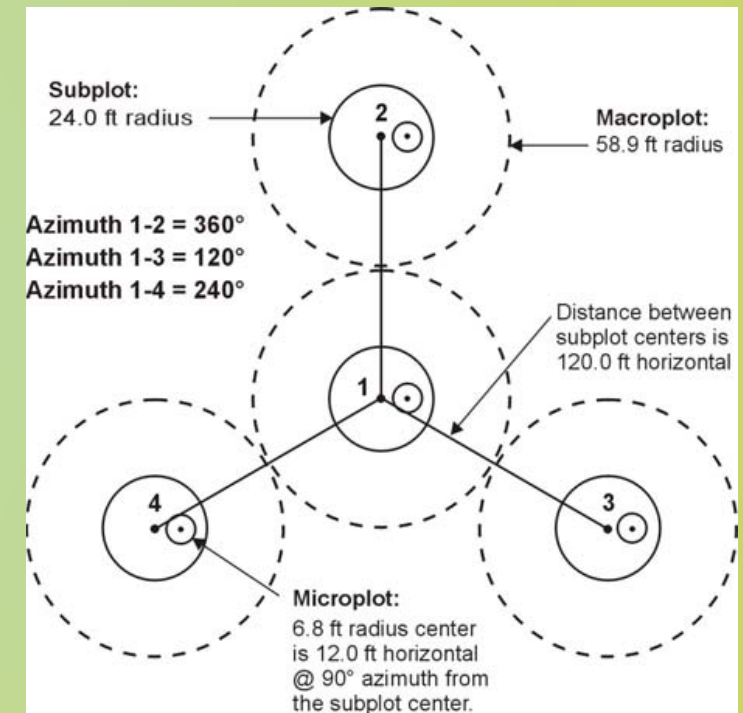


Key Assessment Questions



Use FIA Data to Quantify Disturbance Intensity and Regrowth Rate

- FIA plots
 - Standardized since 2000
 - Distributed across CONUS at 5 km intervals
 - Revisited once every 5 years in eastern US and every 10 years in Western US
 - Most plots measured at least twice since 2000
 - Disturbance intensity
 - Growth rates
- Link field measurements to satellite based disturbance data
 - Need to tease out errors in the FIA data
 - Some remeasurements may not be from the same location



FIA Plot Design

More to come, thanks to the support of
this great program



LCLUC

Land-Cover / Land-Use Change Program