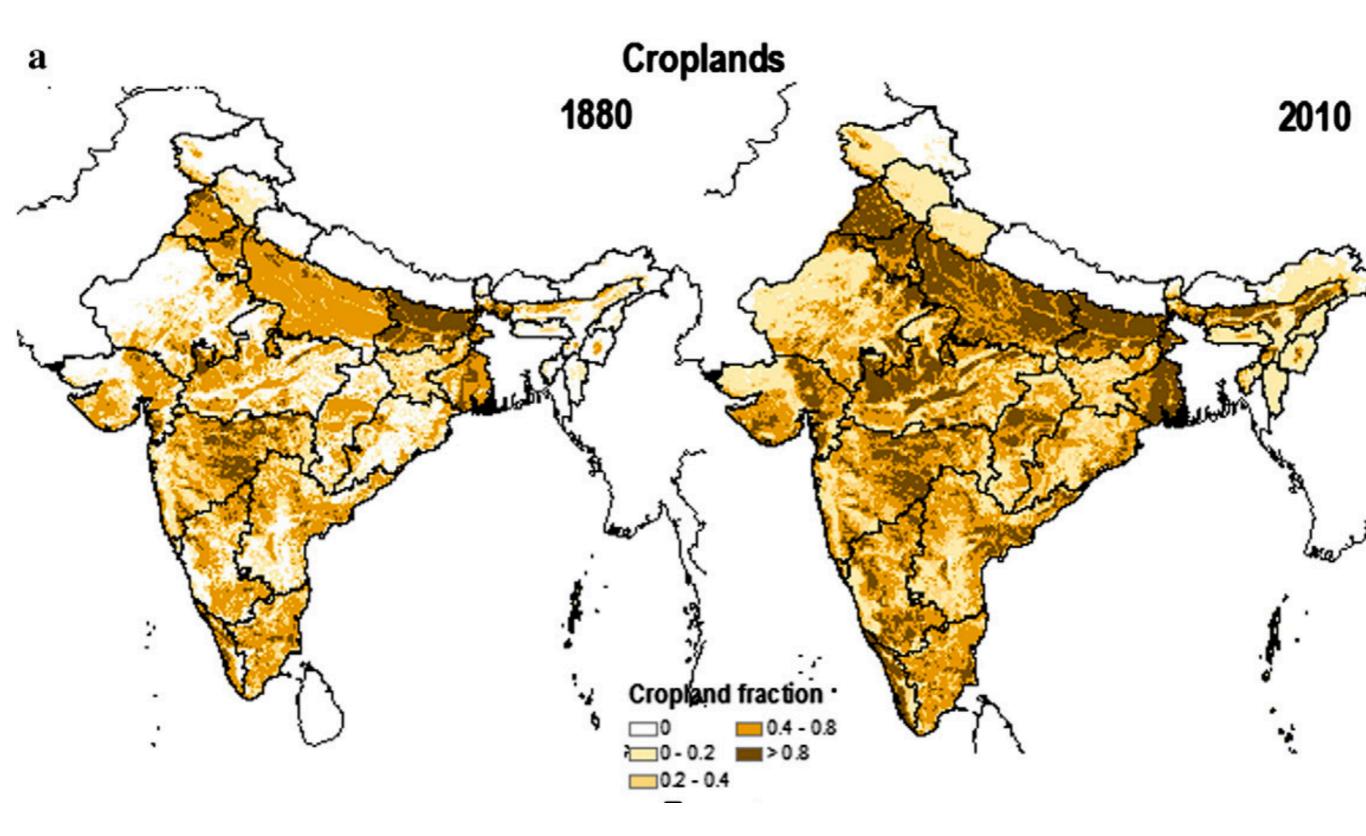
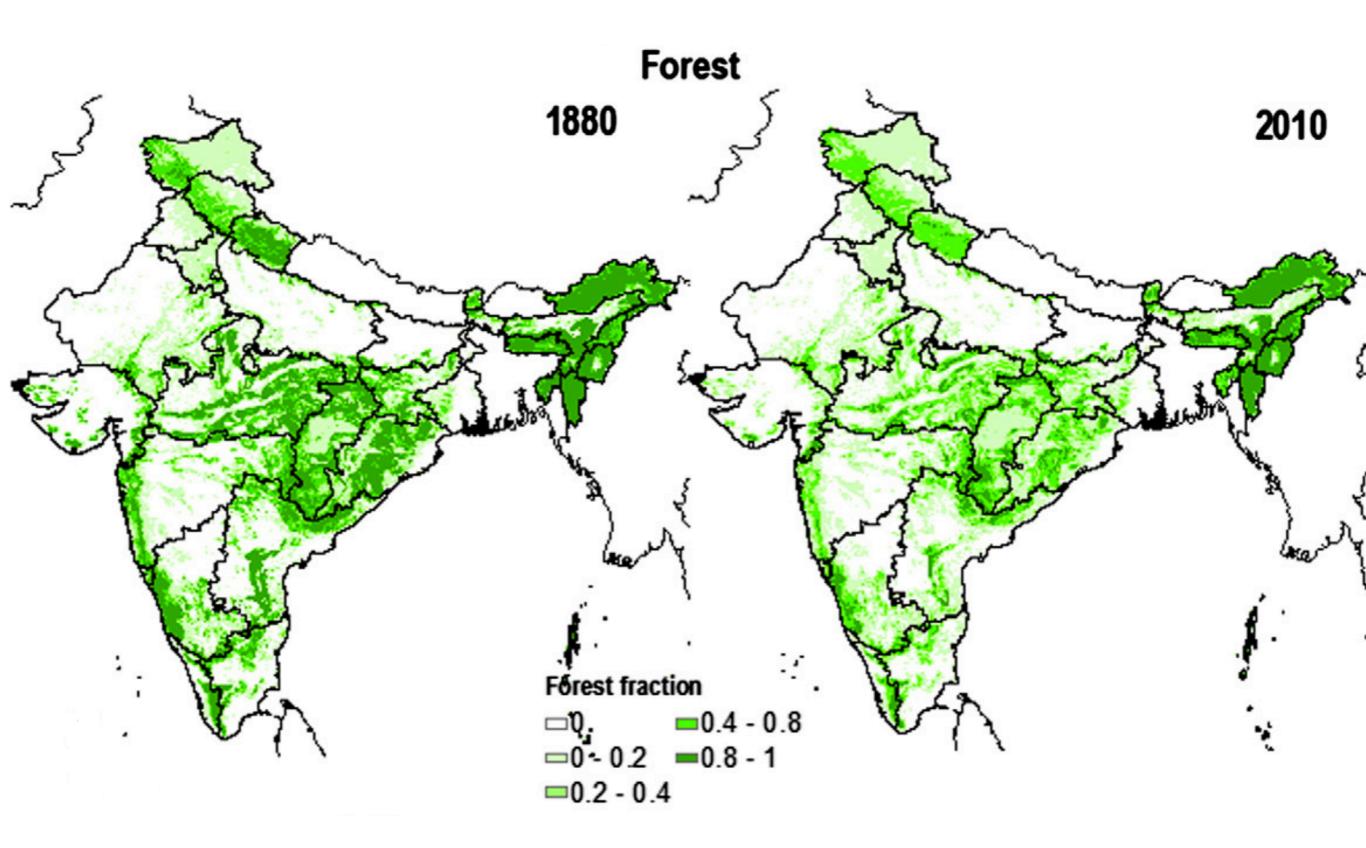
Assessing the Extent and Drivers of Forest Plantation Establishment in Andhra Pradesh

Randolph H. Wynne, Valerie A. Thomas, Haripriya Gundimeda, Gregory S. Amacher, Kelly M. Cobourn, Gunnar Köhlin, Paige T. Williams, Snehal More



Tian et al. 2014 Global and Planetary Change 121: 78-88



Tian et al. 2014 Global and Planetary Change 121: 78–88

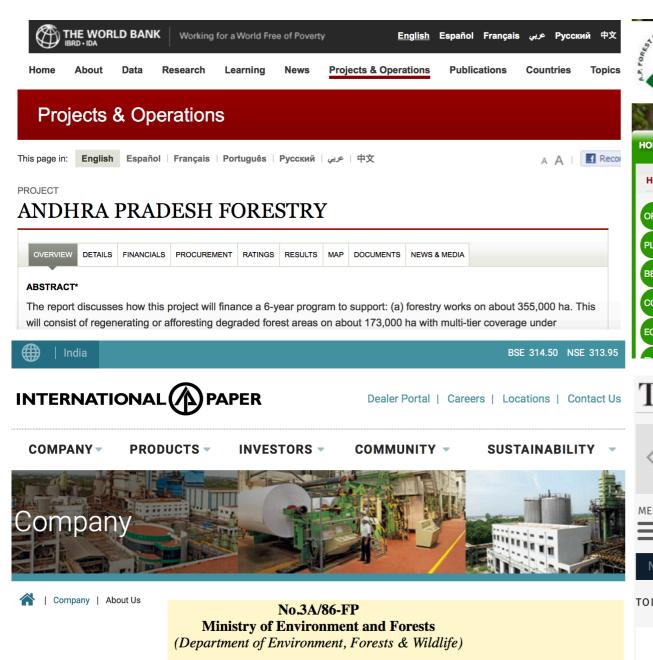




Conversion from rice to typical clonal hybrid Casuarina plantation. The Forest Survey of India notes tree cover > 11,100 km² was added during the period 2001 to 2015.

What might be causing this conversion to forest plantations from agriculture?

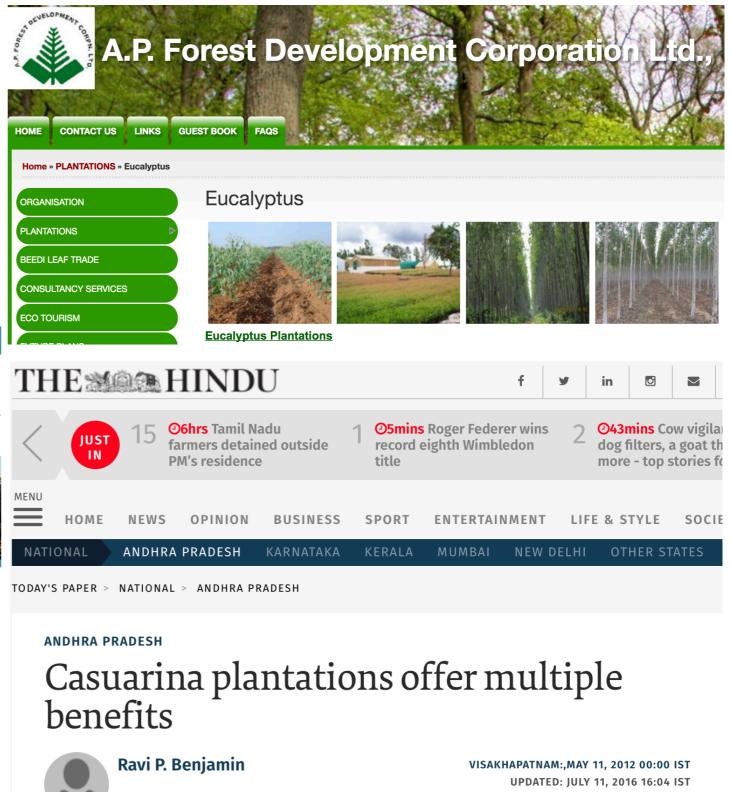
- Productive pest-resistant clones of Eucalyptus, Subabul and Casuarina
- Reduced human inputs compared to crops
- 'Absentee' landlords
- Marginal agricultural lands
- Desire to maintain land ownership
- Policies (National Forest Policy of 1988, state-specific)



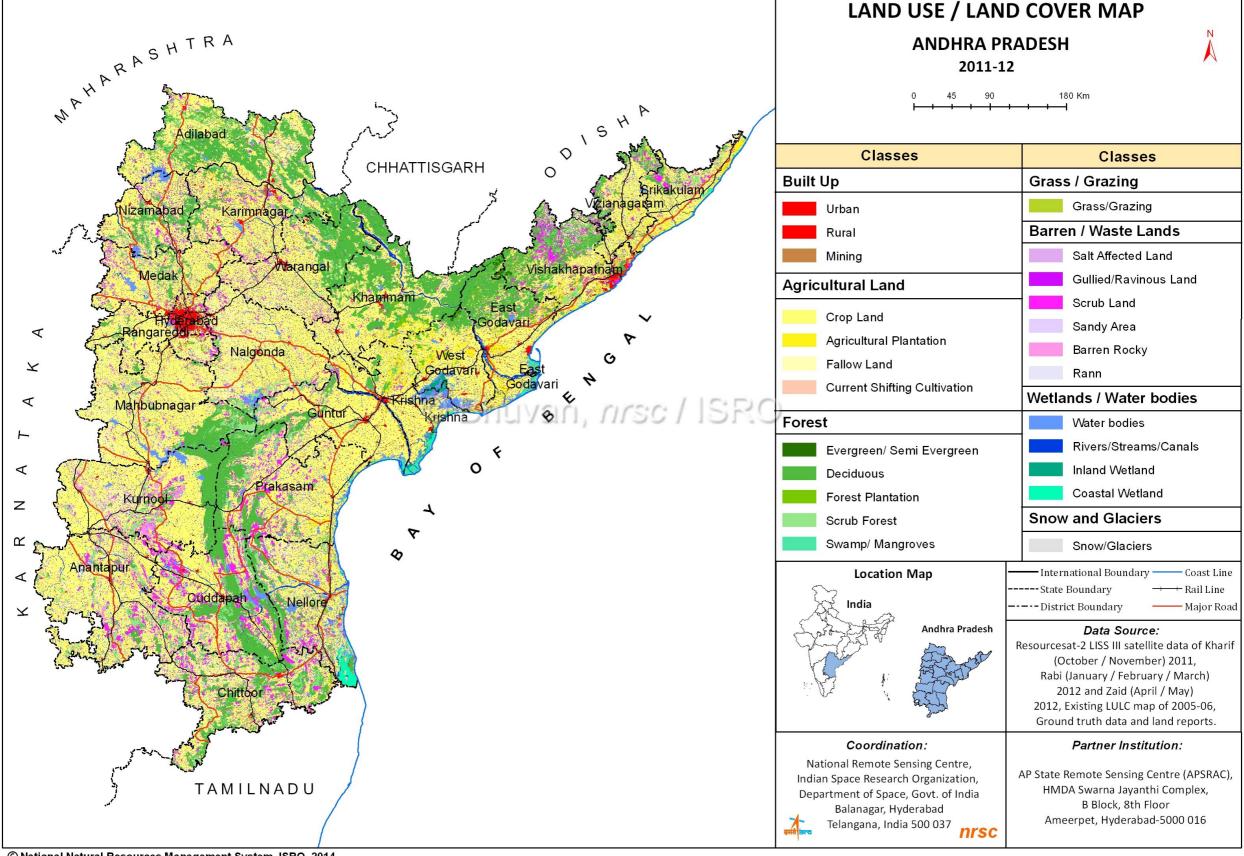
Paryavaran Bhavan, CGO Complex, Lodi Road, New Delhi - 110 003. Dated the 7th December, 1988.

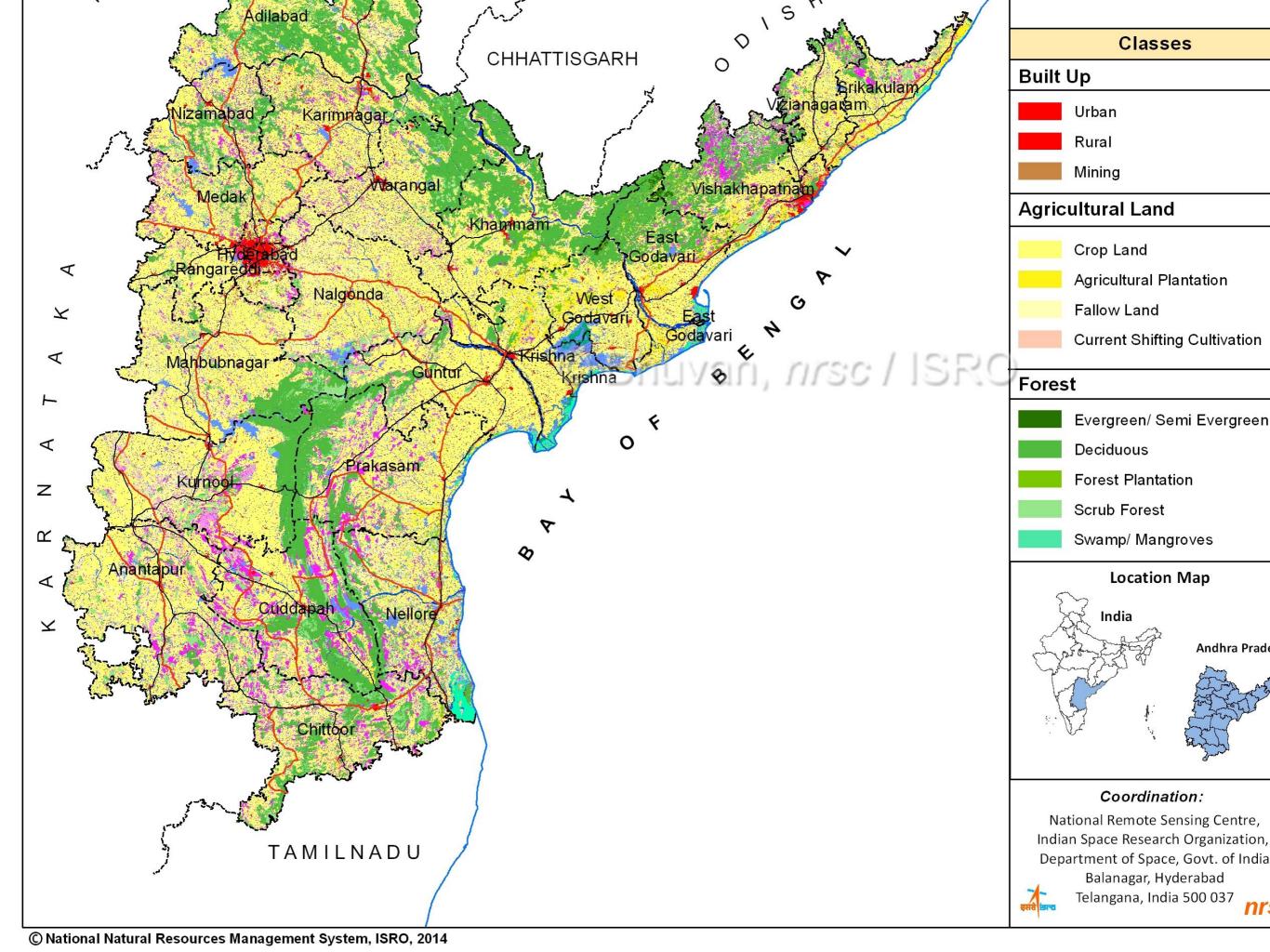
RESOLUTION

National Forest Policy, 1988









Economic Analysis

Determine incentives for forest processing firms to establish plantation agreements with farmers – phase 1 (year 1)

- → What is the value to firms from these agreements?
- → Do these agreements improve economic efficiency?

Determine incentives for farmers to adopt forest plantations – Phase 2 (year 2)

- → What payment will farmers accept to adopt plantations for household production?
- → What characteristics of farmers, costs, and market opportunities drive plantation adoption?

Integrate farmer/firm decision models into land use change predictions – phase 3 (year 3)

Plantation Wood Value

 Value marginal product: additional value of production from an additional ton of wood from plantations

$$\rightarrow VMP_i = \frac{d\gamma_{Fi}f_i(T_F, \psi_F, S; \widehat{\beta})}{d\psi_F}$$

- Economic efficiency: can the firm produce more for any given input?
 - \rightarrow comparison of estimated γ_{Fi} for firms with and without plantation agreements

Andhra Pradesh Mills

Categorical variable	Number of firms	Proportion of observations (%)
Rural location	638	51.17
Urban location	638	48.36
Privately-owned	463	42.76
Individual proprietorship	463	17.71
Government-owned	463	57.24
Not ISO 1400 certified	127	91.34
ISO 1400 certified	127	8.66

Plantation Wood Importance

• Production function for firm i (y_{Fi} = value of production at time t)

$$y_{Fi} = \gamma_{Fi} f_i(T_F, \psi_F, S; \varepsilon_i, \beta)$$

 γ_{Fi} efficiency score parameter (1 = perfect efficiency)

T_F labor input

 ψ_F wood input

S other factors important to production

 ε_i stochastic error

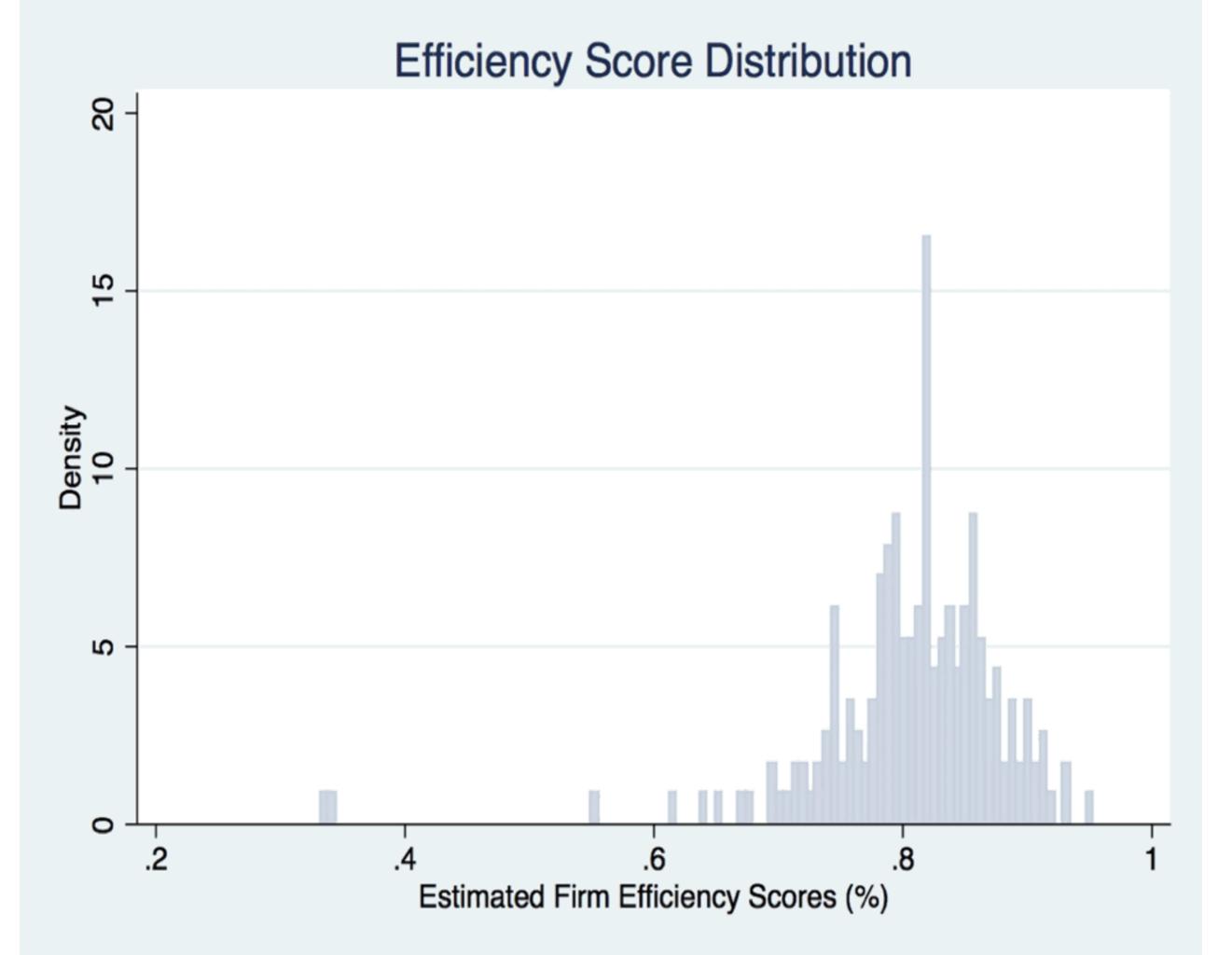
β coefficients to estimate

 Production function is estimated with firm level data on inputs and outputs, using stochastic frontier methods in econometrics

Stochastic Production Frontier Estimation Results							
Log likelihood	-32.241898		N. Observations =		187		
Wald chi2(5) =	11133.680		Prob > chi 2	=	0.000		
Dependent variable: ln(gross value of outputs)	Coefficient	Std. Err.	Z	P>z	[95% Conf.	Interval]	
Independent variables:							
ln(value of fuel)	0.118	0.023	5.17	0.000	0.073	0.163	
ln(value of materials)	0.622	0.036	17.13	0.000	0.550	0.693	
ln(total value of salaries)	0.114	0.039	2.93	0.003	0.038	0.190	
ln(value of working capital)	0.074	0.020	3.78	0.000	0.036	0.112	
ln(gross value of fixed capital)	0.116	0.035	3.27	0.001	0.046	0.185	
Constant	0.727	0.249	2.92	0.004	0.239	1.216	
Error terms:	Coefficient	Std. Err.	t	P>t	[95% Conf.	Interval]	
sigma_u_sqr	0.086	0.030	2.82	0.005	0.043	0.172	
sigma_v_sqr	0.053	0.011	4.99	0.000	0.036	0.078	
Likelihood ratio test	6.3456						

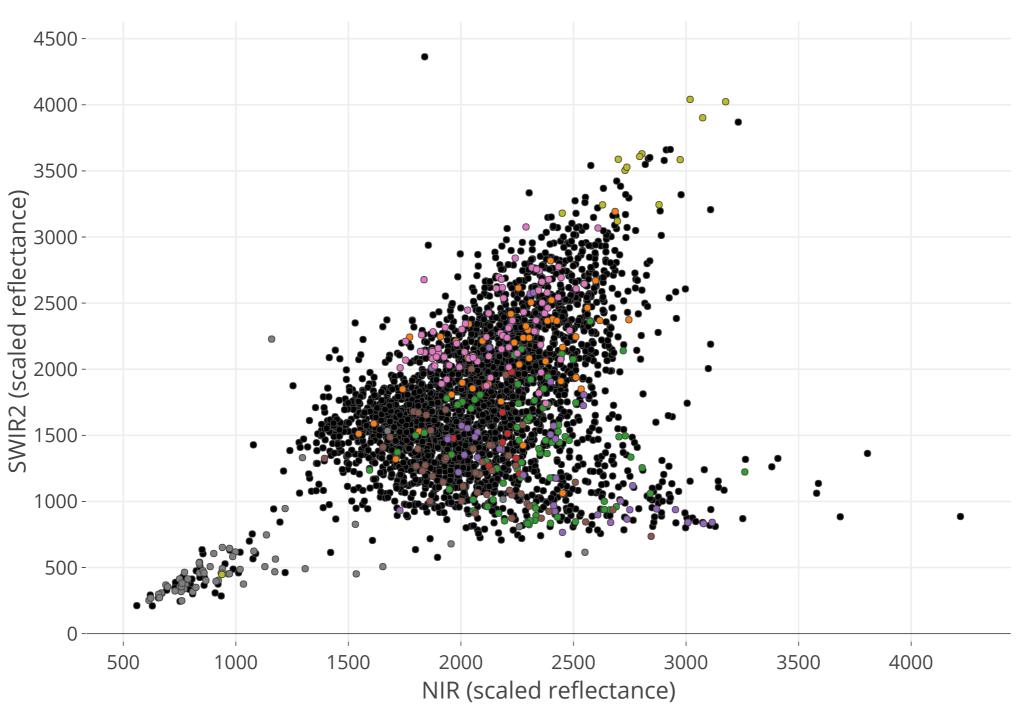
Stochastic Production Frontier Estimation

Materials = > 90% Wood Inputs



Economic Analysis Phase I Results

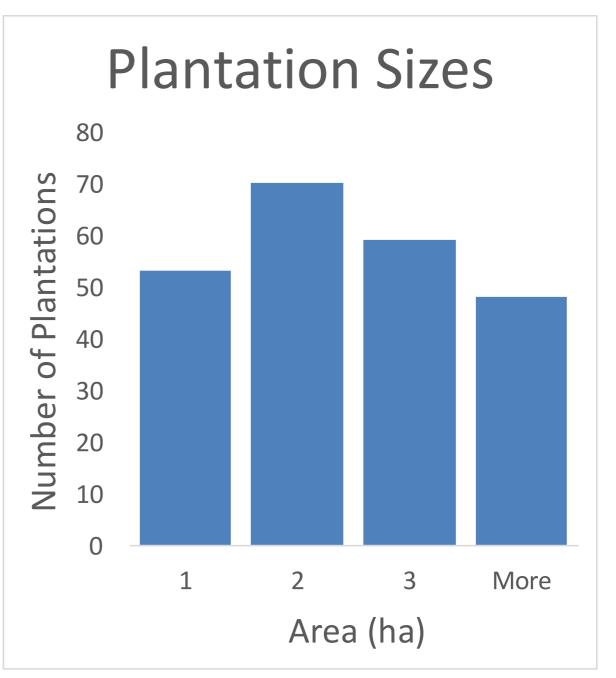
- We have estimated a prediction equation for firm level willingness to pay for wood as function of inputs (value marginal product function)
- We find wood to be the most statistically significant and important input to production for Andhra Pradesh forest product firms
- On average, each additional \$R of wood increases the value of production by 0.62 \$R (\$Rs = 0.015 USD)
- Firms on average are operating at about 75-85% of the theoretically efficient level (γ_{Fi} , efficiency score parameter, = 1)
- Question still to evaluate is whether firms with plantation agreements have higher efficiency scores than firms without



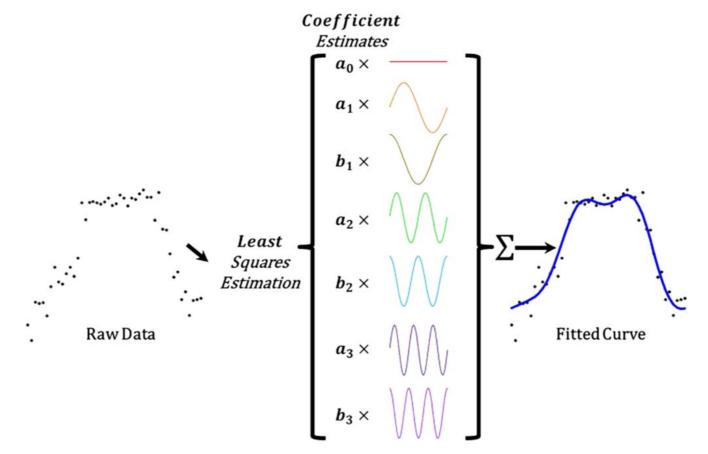
- Image
- Agriculture
- Casuarina
- Eucalyptus
- Other Forest Plantation
- Natural Forest
- Urban
- Water
- Sand

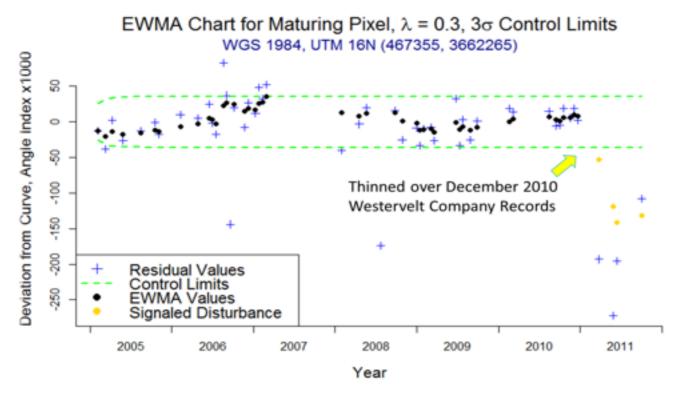
Small!

n	230
Min	0.4
Max	9.7
Mean	2.1
First Quartile	1.0
Median	1.8
Third Quartile	2.6
Standard Deviation	1.4
Variance	2.1
Standard Error	0.1

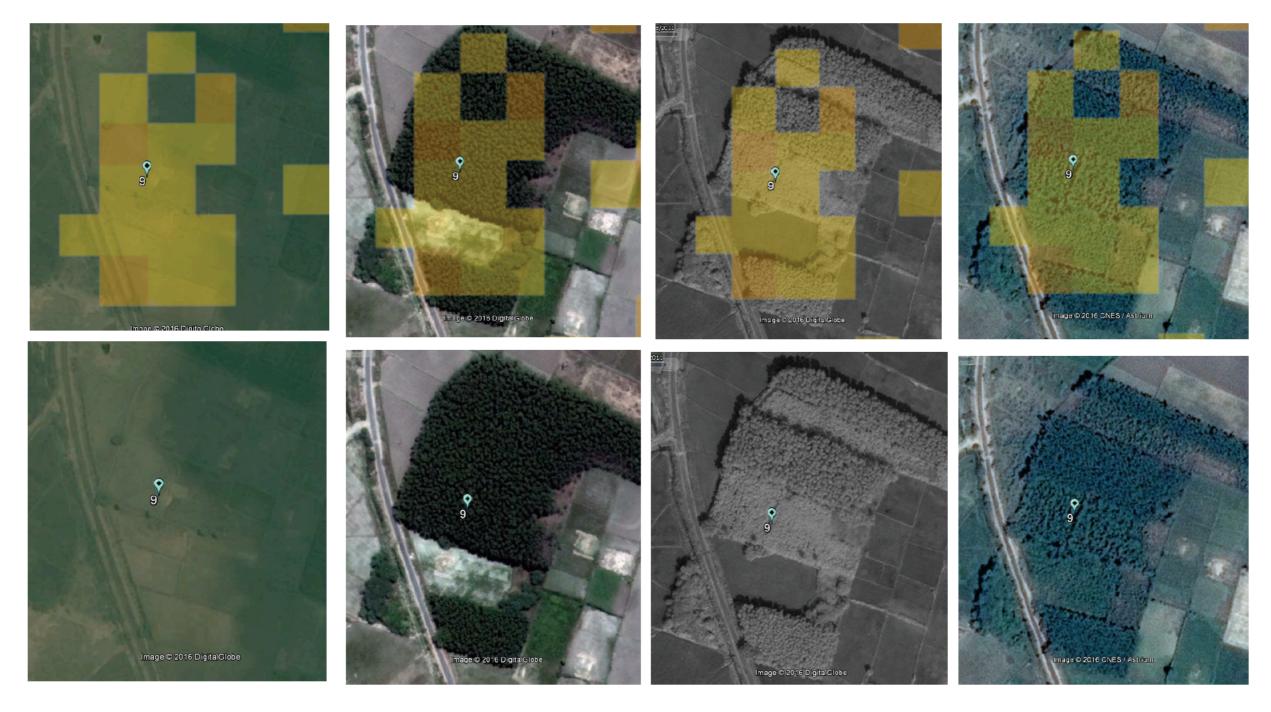










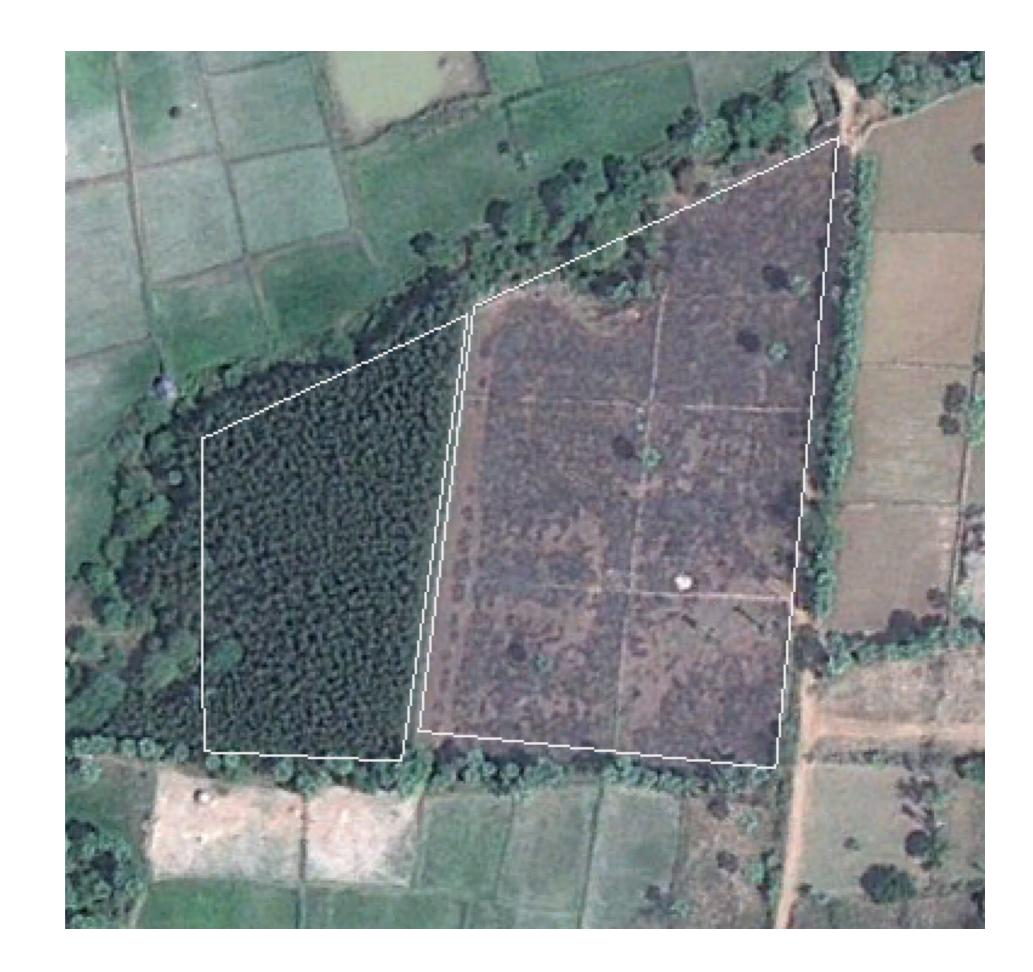


Example of harmonic coefficient-based classification of a forest plantation in Andhra Pradesh. 166 Landsat 7 and 8 images from path 143 row 49 spanning from 2000 to 2016 were used in this analysis. Results shown used SWIR2. Note that while the plantation is identified that there are remnant issues with both omission and commission errors.

Casuarina

Casuarina in East Godavari
2 landowners
31 Dec 2006





27 Feb 2011



18 Nov 2013



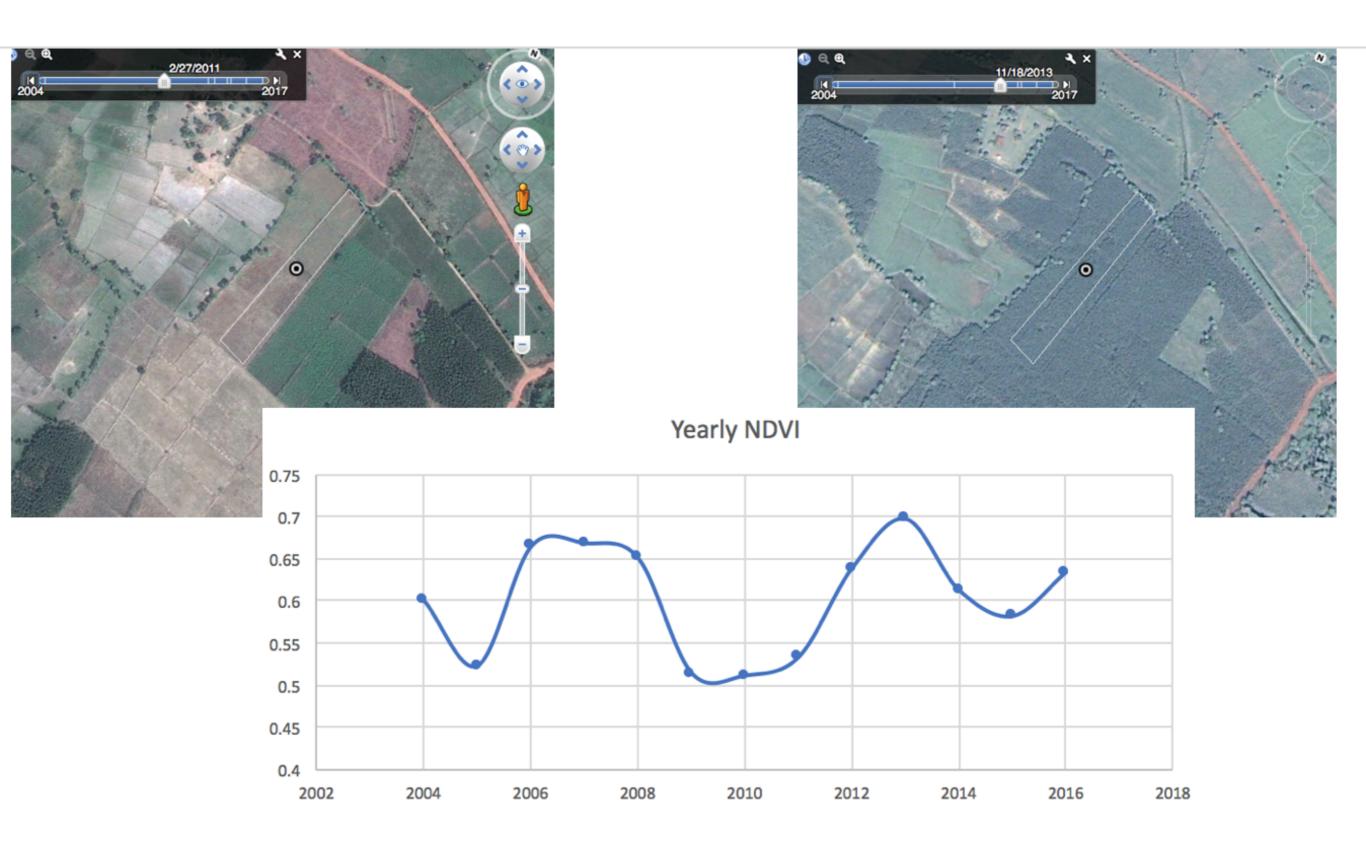
20 Dec 2014



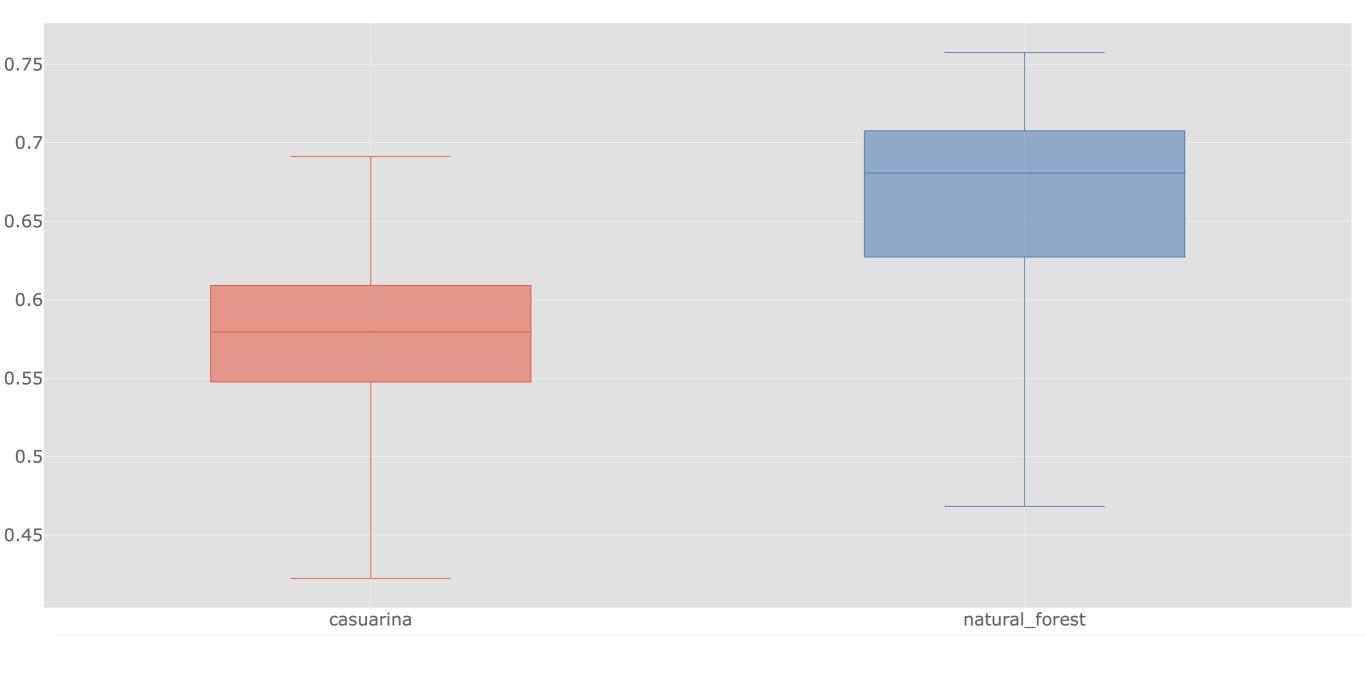
12 Mar 2015



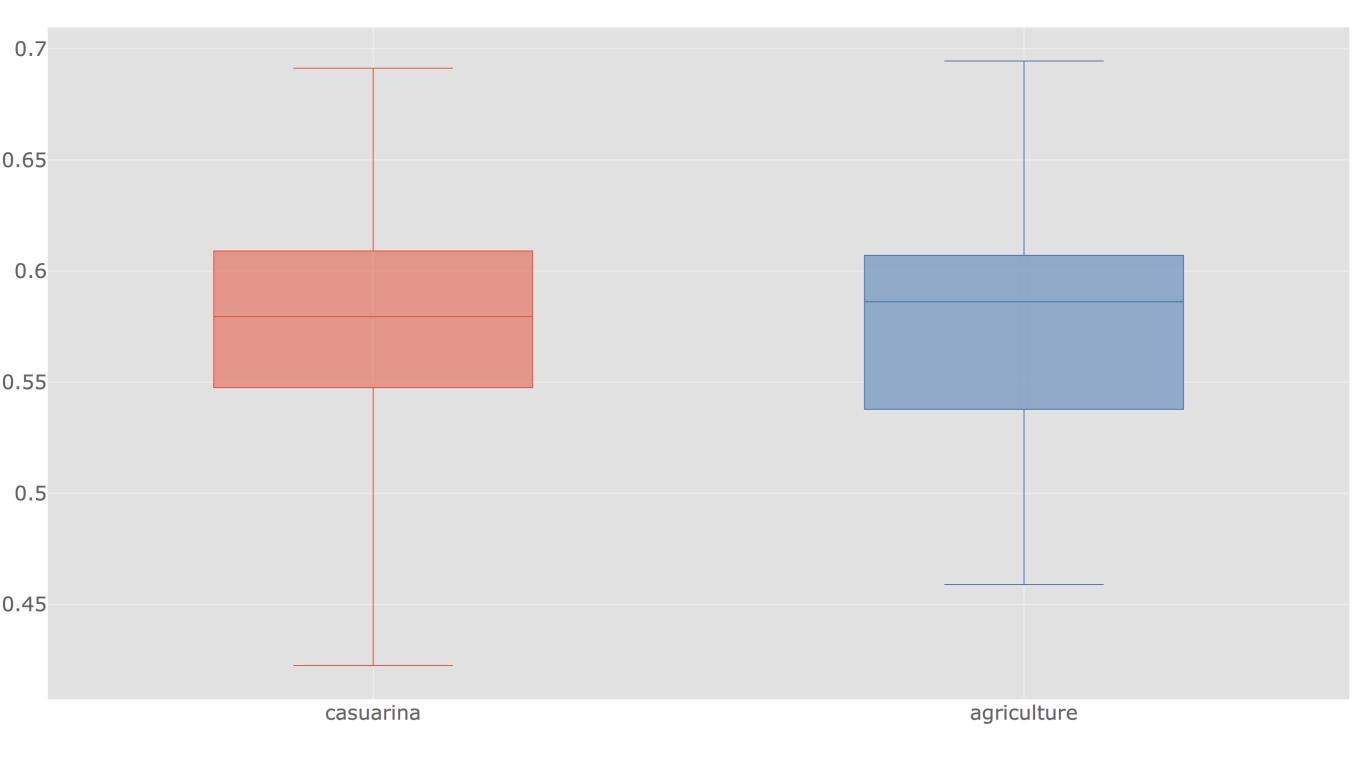
19 Feb 2016



Means of Annual Greenness Maxima: Natural Forest vs. Planted Casuarina



Means of Annual Greenness Maxima: Planted Casuarina vs. Agriculture



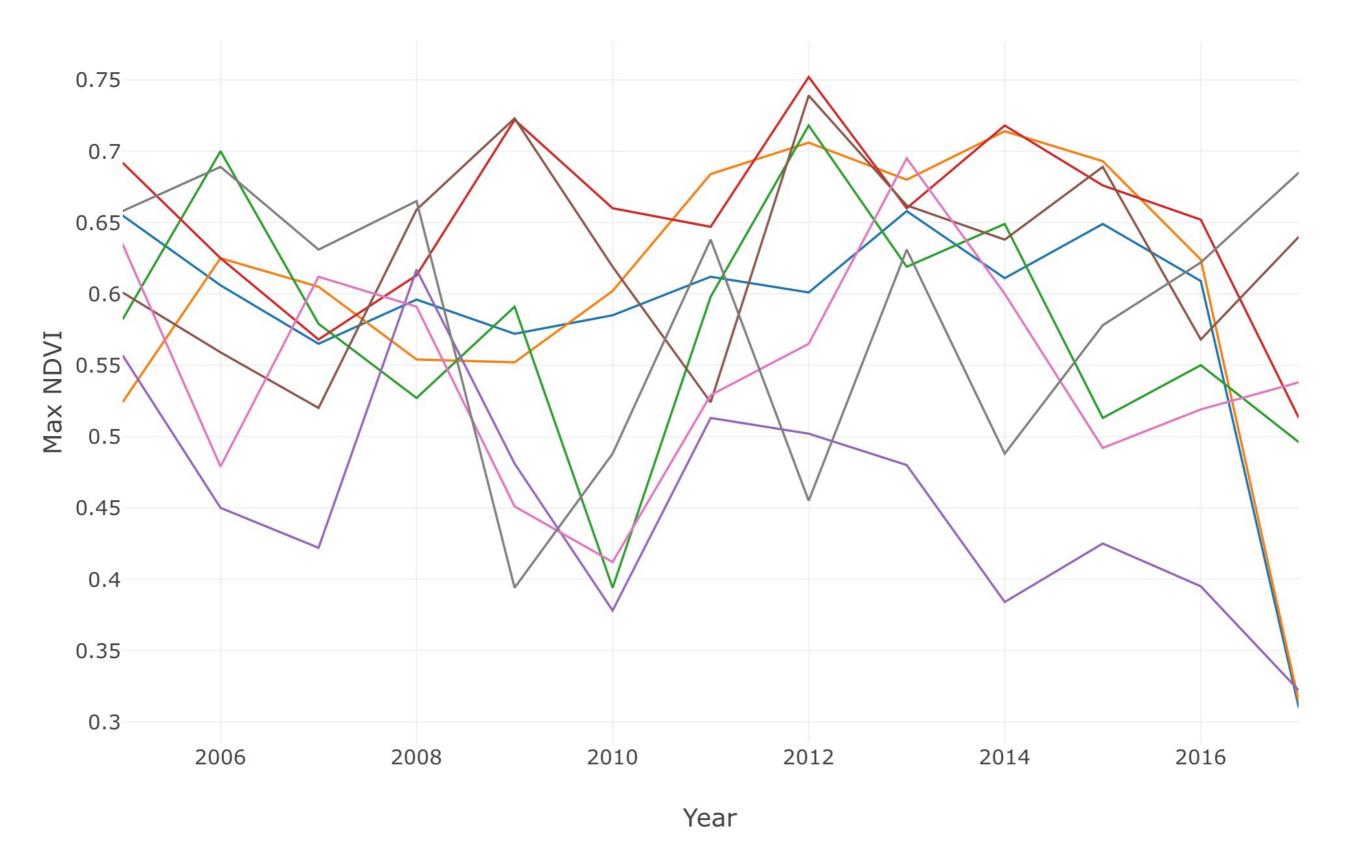
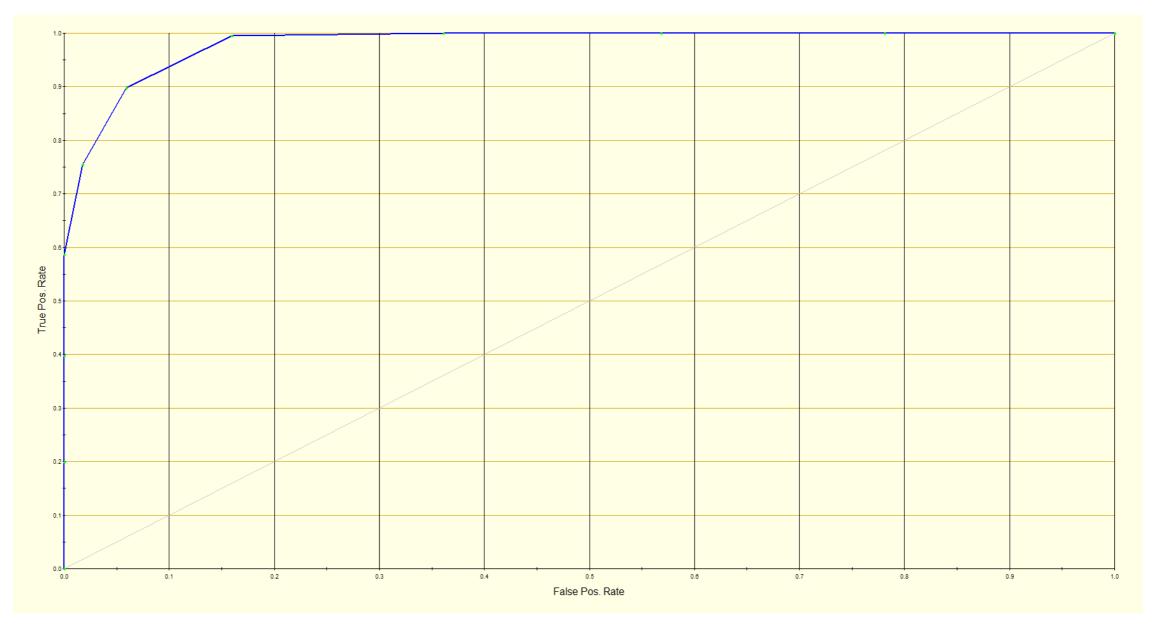
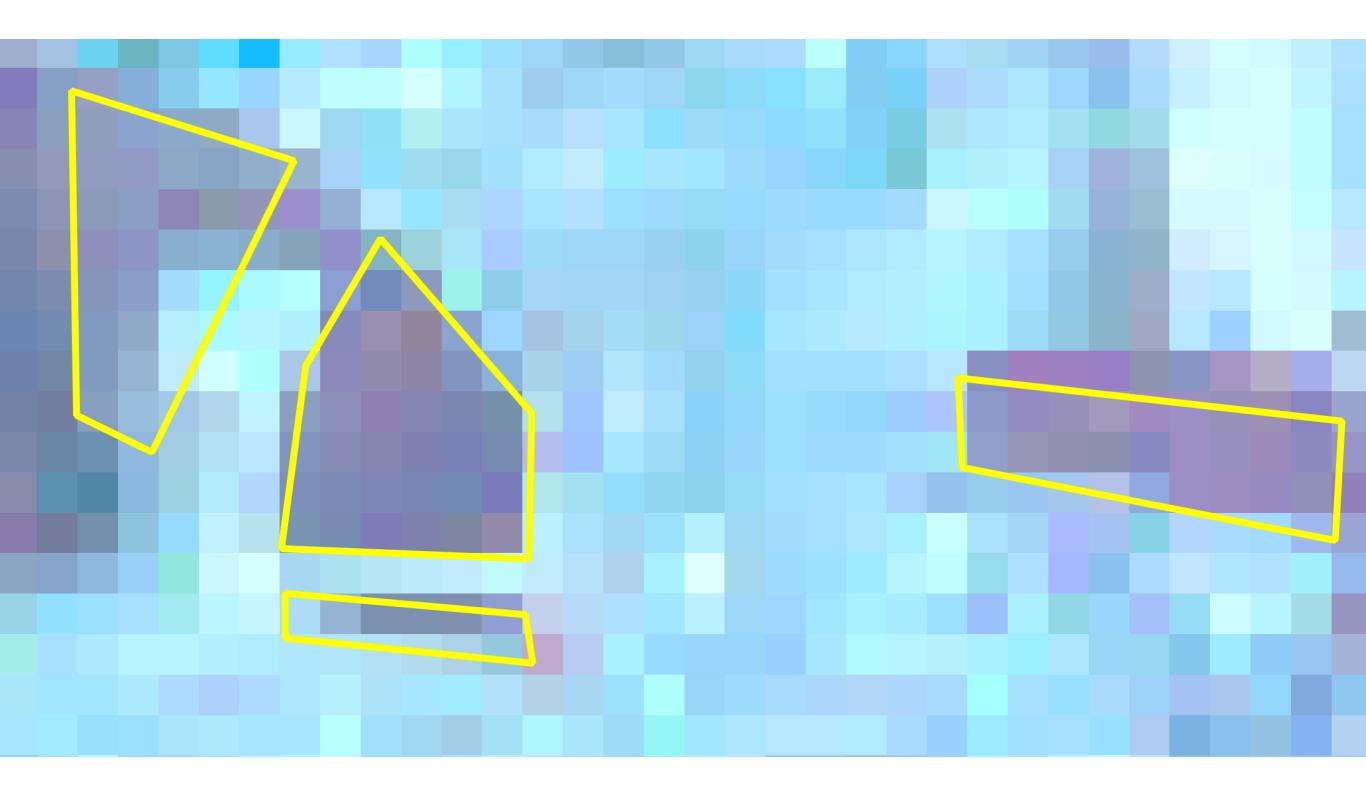
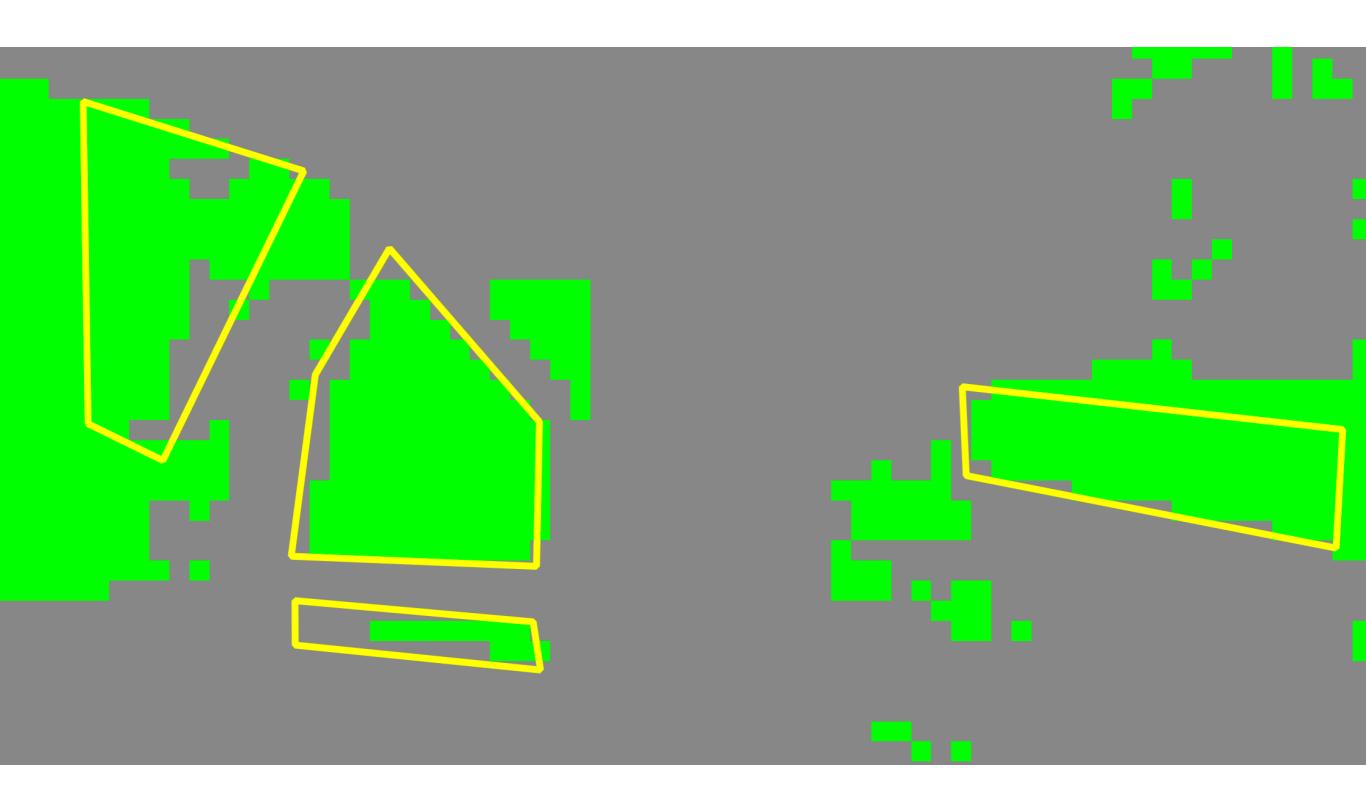


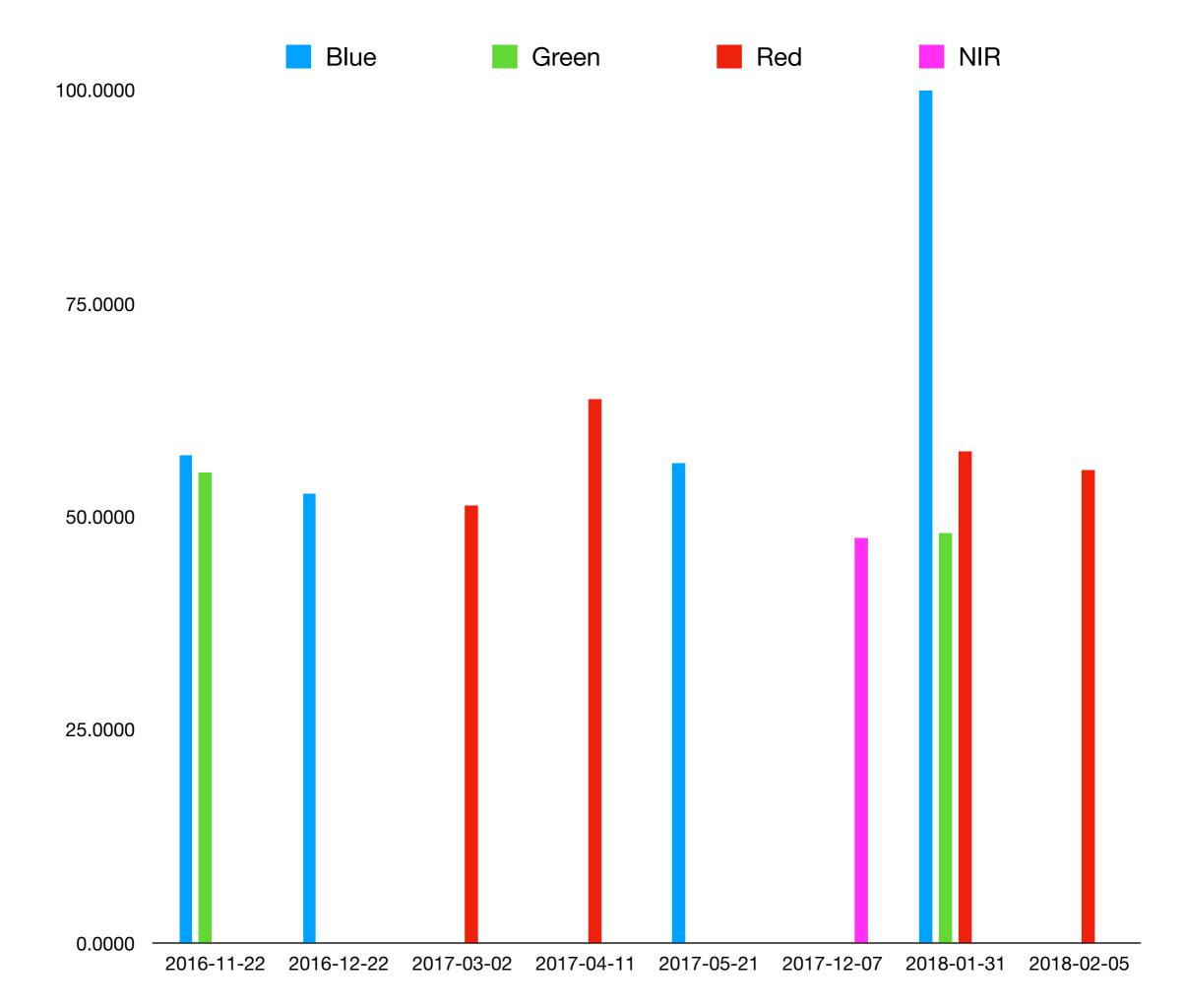
Table 2: Error matrix from pilot Sentinel 2 classification.

Actual Class	Natural Forest N = 54	Nonforest N = 170	Plantation N = 141
Natural Forest	38	0	8
Nonforest	3	166	27
Plantation	13	4	106









Downsides

- Food security?
- Water use (trees and mills) and water quality (mills)
- Even-aged monocultures

Upsides

- Carbon accounting slightly positive (preliminarily)
- Potential decrease in radiative forcing
- Improved local and national economies
- Uptick in other forest-based ecosystem services
- Smallholder land tenure

Conclusions

- Plantation forestry rapidly expanding in Asia
- Small spatial extent and rapid harvest-regeneration cycle present interesting — but resolvable — remote sensing challenges
- Understanding the drivers and ramifications of these new trees outside forests vital

