Bringing forest management into Earth system models: Insights from observations and theory

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MANangement and Disturbance in FORest Ecosystems



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What is forest management?

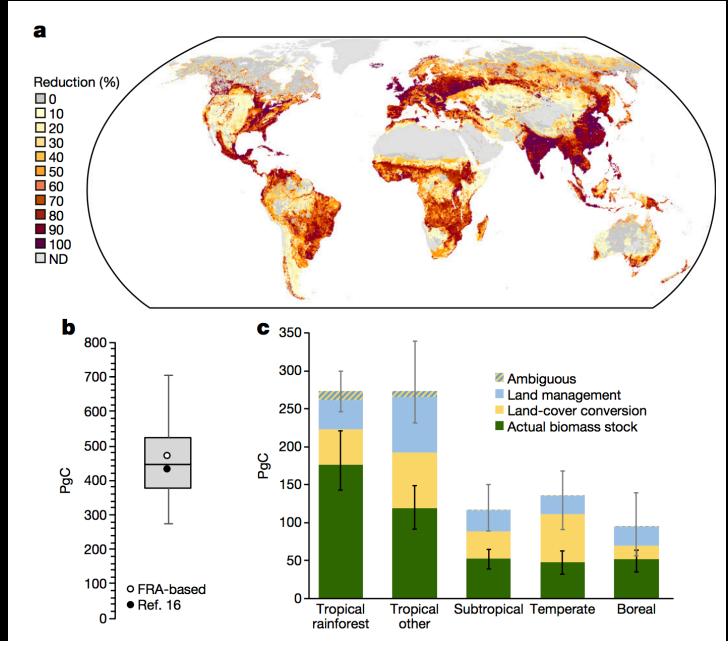
And how do current Earth system models represent it?





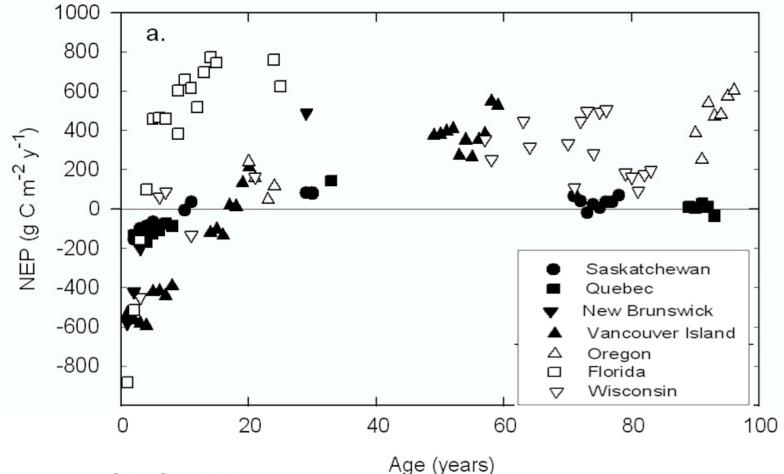
Unexpectedly large impact of forest management and grazing on global vegetation biomass

Karl-Heinz Erb¹, Thomas Kastner^{1,2}*, Christoph Plutzar^{1,3}*, Anna Liza S. Bais¹, Nuno Carvalhais^{4,5}, Tamara Fetzel¹,



Nature 2018

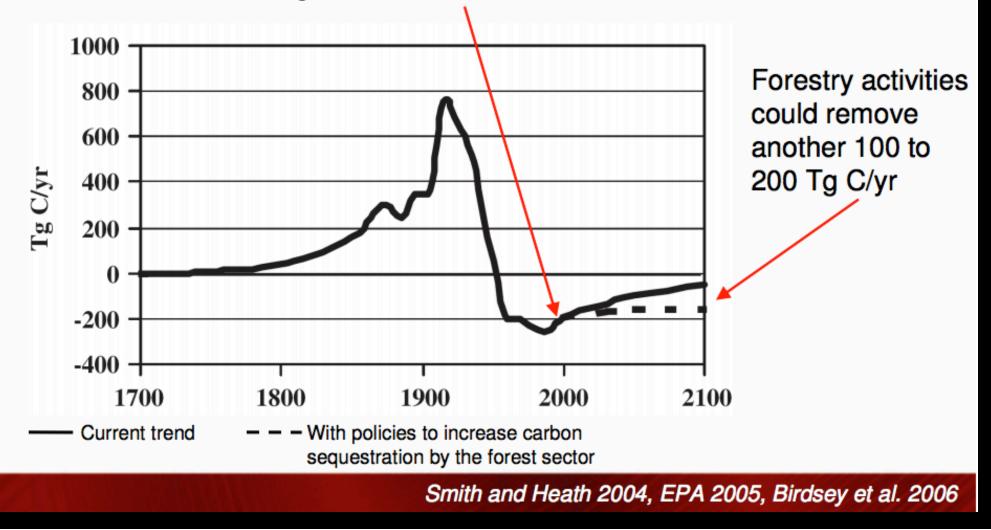
We know forest age determines NEP



Amiro et al., JGR-G, 2010

We know carbon management practices have significant potential

US forests annually sequester the equivalent of 10% of US carbon dioxide emissions from burning fossil fuels



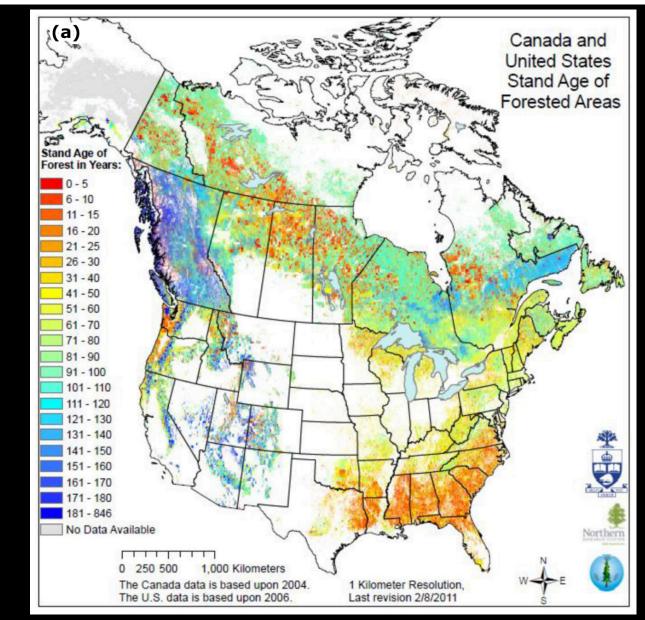
But we really don't know how to map, observed, and simulate forest management to understand continental to global scale effects of these activities on climate and ecosystems

So let's review some attempts

Can we better map management?

Age structure and disturbance legacy of North American forests

Y. Pan¹, J. M. Chen², R. Birdsey¹, K. McCullough¹, L. He², and F. Deng²



Pan *et al., Biogesciences,* 2011

Management Functional Types

Production Forestry maximizes wood or pulp production



<u>Passive Management</u> may be exploited for timber but lacks any active management practice other than desultory harvest



<u>Preservation Forestry</u> maintains a baseline state to preserve species, ecosystem services, recreation, and aesthetic value

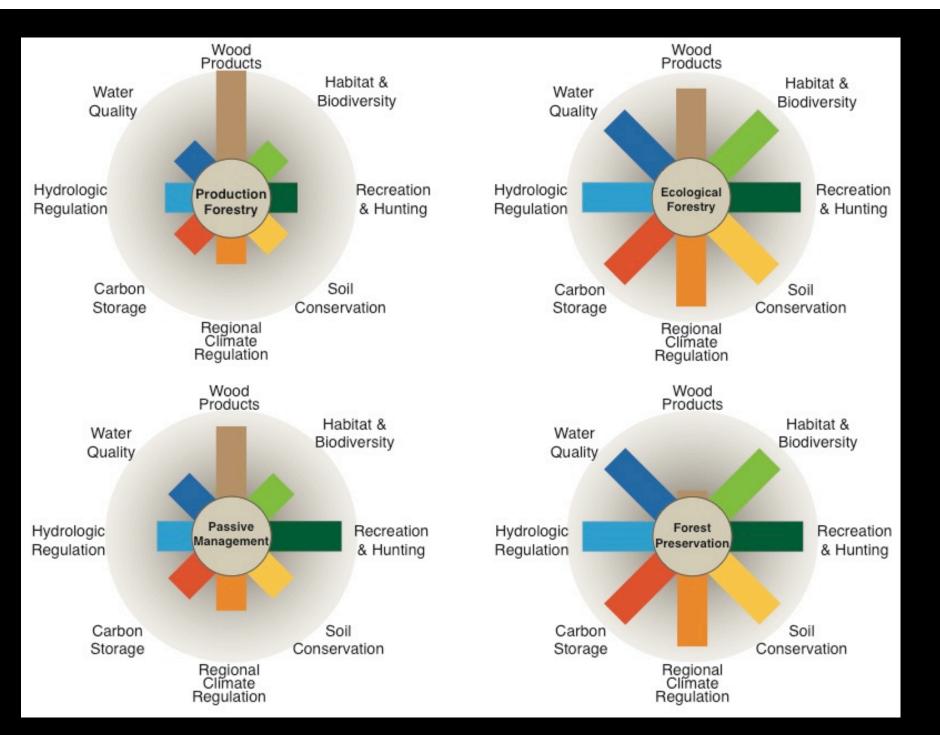


<u>Ecological Forestry</u> Uses ecological principles to balance wood production with habitat and ecosystem services

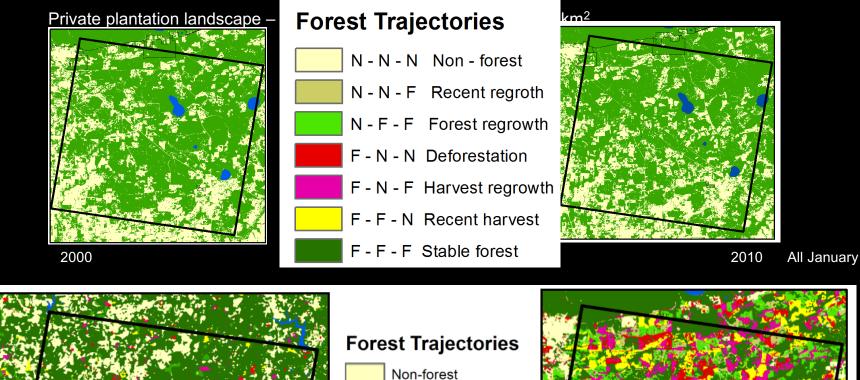


Photo: Oregon BLM

Becknell et al., Bioscience, 2015



Becknell et al., Bioscience, 2015

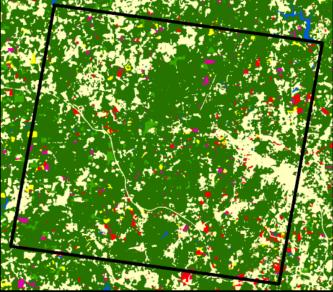


Recent regrowth

Forest regrowth Deforestation

Harvest-regrowth Recent harvest

Stable Vegetation

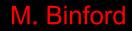


Central North Carolina

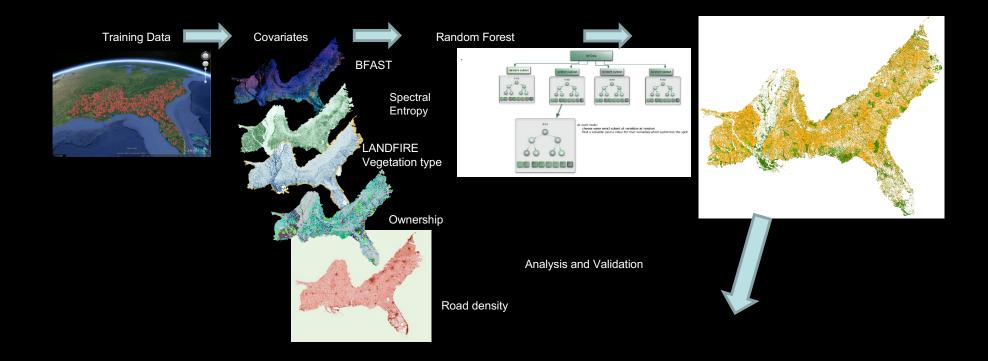


Water

North Florida



Mapping procedure (Binford)

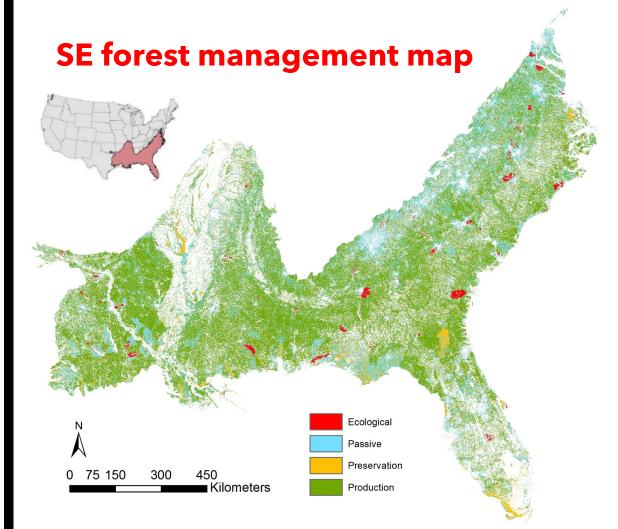


MODIS time-series: Enhanced Vegetation Index Normalized Spectral Entropy of VI BFAST (Breaks For Additive Season and Trend) Ownership, Forest Type, other ancillary data overlay and zonal analysis

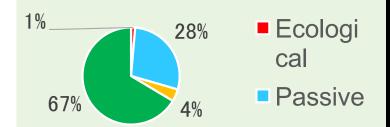
Owner	0	Owner	0	
prp_conifer	0	prp_conifer	0	
entropy	0	entropy	0	
bd_b_mean_diff	0	prp_riparian	0	
prp_riparian	0	bd_b_mean_diff	0	
bd_post_b_slope	0	bi_post_b_slope	0	Ecol
bi_post_b_slope	0	bd_post_b_mean	0	
bi_post_b_mean	0	bd_b_diff	0	Pass
bd_post_b_mean	0	bd_pre_b_slope	0	D
bd_pre_b_slope	0	bi_b_mean_diff	0	Pres
bd_b_diff	0	bi_post_b_mean	0	Prod
bi_b_mean_diff	0	bd_post_b_slope	0	
bd_pre_b_mean	0	bd_pre_b_mean	0	Wet
bi_pre_b_mean	0	bi_pre_b_mean	0	
bi_pre_b_slope	0	bi_b_diff	0	
bi_b_diff	0	bd_b_inqtrng	0	
bd_b_inqtrng	0	bi_pre_b_slope	0	
bi_b_inqtrng	0	bi_b_inqtrng	0	
	20 30 40 50		0 10 20 30 40	
	MeanDecreaseAccuracy		MeanDecreaseGini	

	Cro	ss valida	ation			
	Ecological	Passive	Preservation	Production	Wetlands /	Accuracy
gical	23	1	0	0	1	0.92
'e	1	47	0	0	3	0.92
rvation	0	0	50	0	2	0.96
iction	1	1	0	23	2	0.85
inds	0	1	0	2	17	0.85
		Total Accuracy			0.91	

Cuses Validation



Area of forest classes by percentage

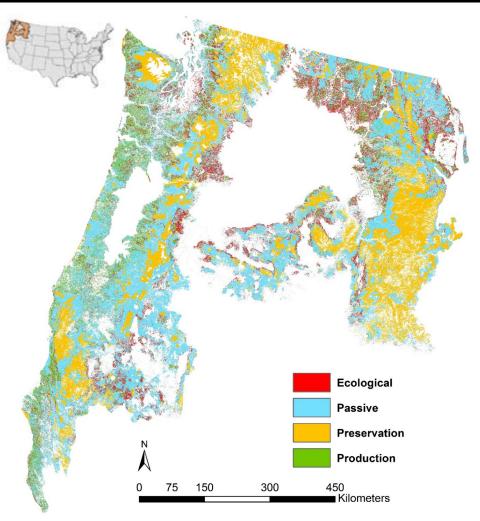


Total forest area: 61,345,169 ha

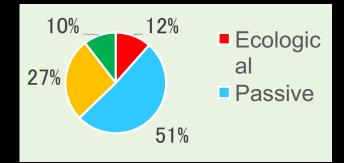
Variable Importance for Random Forest Classification

oro riporion		ontropy	
prp_riparian		entropy	
entropy	0	bd_b_diff	0
lb_b bd_b_diff		bd b mean diff	0
bi b mean diff		bi b mean diff	0
bd_b_mean_diff	0	road_density	0
lb_b_mean_diff	0	lb_b_mean_diff	0
road_density	0	prp_riparian	0
bi_b_diff	0	prp_conifer	0
bd_b_inqtrng	0	bi_b_diff	0
entropy_seasonal	0	lb_b_diff	0
lb_b_diff	0	bd_b_inqtrng	0
lb_b_inqtrng	0	entropy_seasonal	0
prp_conifer	0	lb_b_inqtrng	0
bi_b_inqtrng	0	bi_b_inqtrng	0
ownership	0	ownership	0
detected_breaks	0	detected_breaks	0
bi_sb_range_diff	0	bi_sb	0
lsb_b	0	bd_sb	0
lsb_sb_range_diff	0	lsb_sb_range_diff	0
bd_sb	0	bi sb_range_diff	0
bi b	0	lsb b	0
bisb	0	bi b	0
bd sb entropy diff	0	Isb sb entropy diff	0
bi sb entropy diff	0	lsb sb ingtrng	0
lsb_sb_entropy_diff	0	bd sb entropy diff	0
lsb_sb_ingtrng	0	bi sb entropy diff	0
bd sb ingtrng	0	bd sb ingtrng	0
	0 10 30		0 10 20 30
N	leanDecreaseAccuracy		MeanDecreaseGini

PNW forest management map



Area of forest classes by percentage

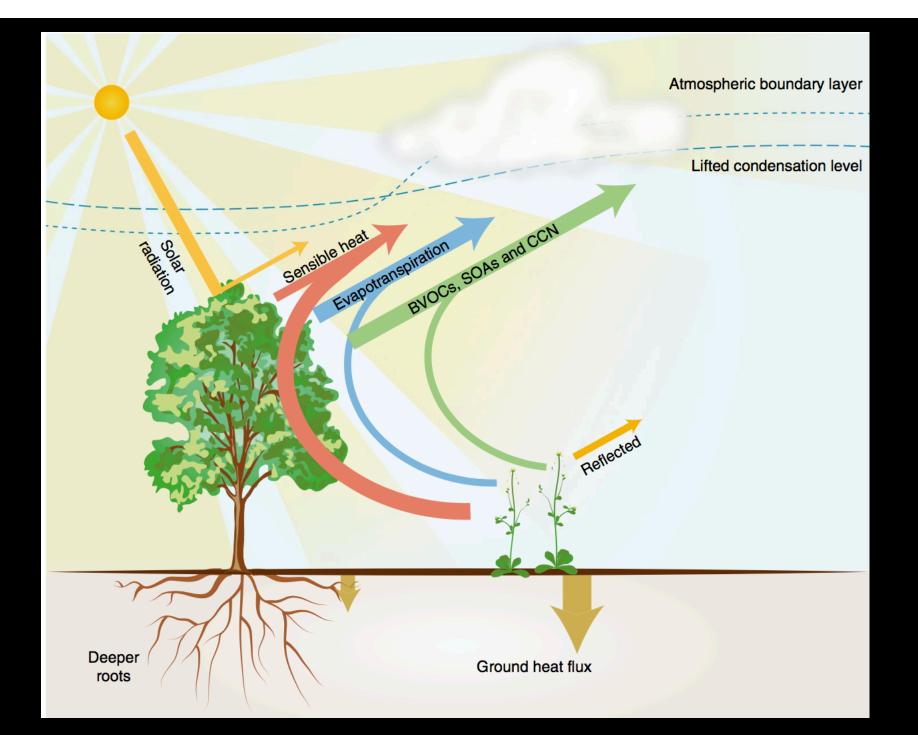


Total forest area: 28,988,131 ha

Variable Importance for Random Forest Classification

usfs_thematic	o	usfs_thematic	o
ownership	o	road_density	0
entropy	0	ownership	0
road_density	0	bd_b_mean_diff	0
lb_b_mean_diff	0	bi_b_diff	0
bd_b_mean_diff	0	lb_b_mean_diff	0
bi_b_diff	0	entropy	0
entropy_seasonal	0	entropy_seasonal	0
prp_conifer	0	lb_b	0
lb_b	0	bi_b_mean_diff	0
bi_b_mean_diff	0	prp_conifer	0
bd_b_diff	0	bd_b_diff	0
lb_b_diff	0	lb_b_diff	0
bd_b_inqtrng	0	bd_b_inqtrng	0
lb_b_inqtrng	0	bi_b_inqtrng	0
prp_riparian	0	lb_b_inqtrng	0
bi_b_inqtrng	···· 0	prp_riparian	0
detected_breaks	0	detected_breaks	0
			l_{1}
	20 40 60 80		0 40 80 120
1	MeanDecreaseAccuracy	/	MeanDecreaseGini

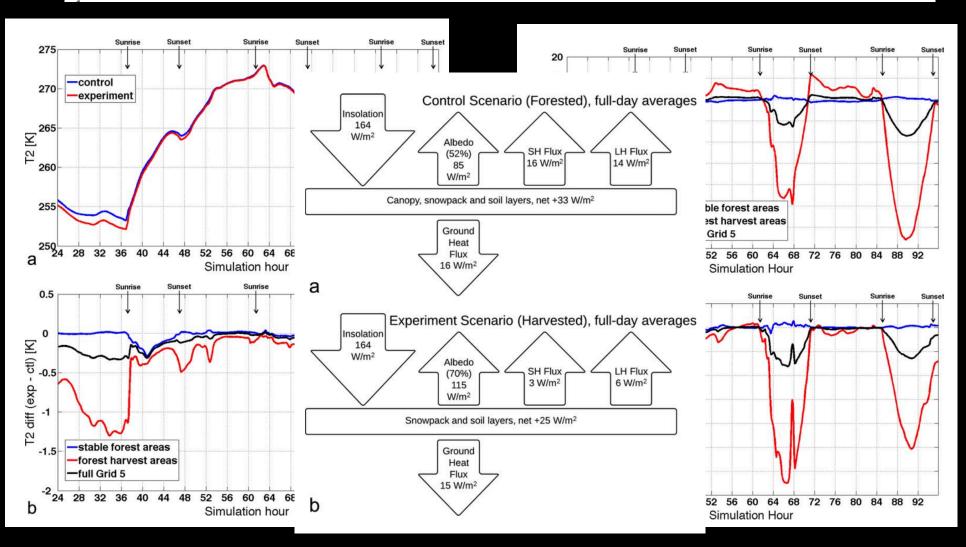
What are the effects of management on the atmosphere?



Stoy et al, Nature Clim Change, 2018

Impacts of forest harvest on cold season land surface conditions and land-atmosphere interactions in northern Great Lakes states

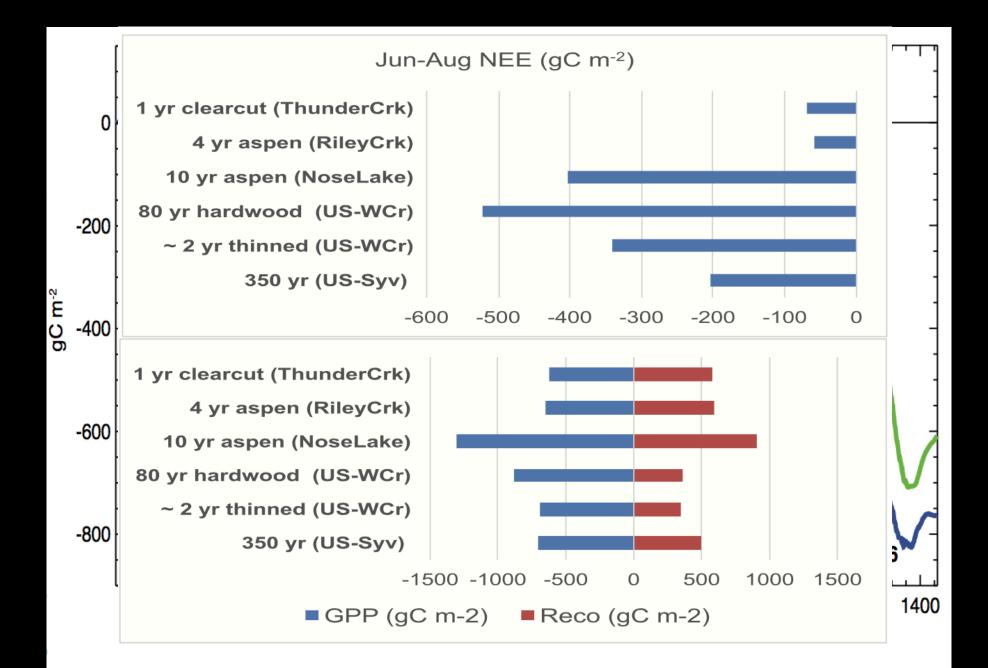
Matthew Garcia¹, Mutlu Özdogan¹, and Philip A. Townsend¹



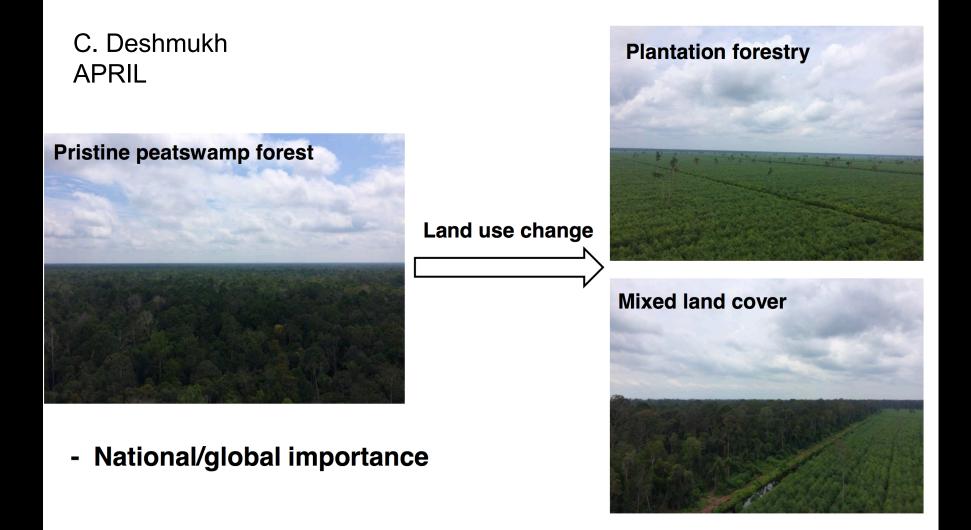
JAMES, 2014

Let's thin a forest!

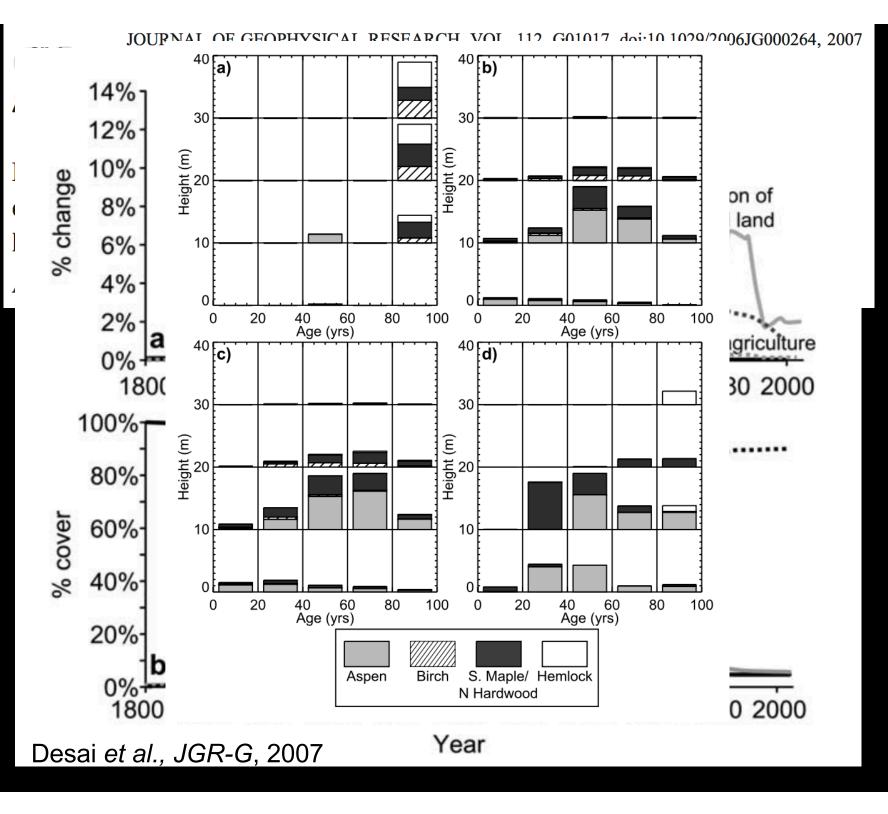


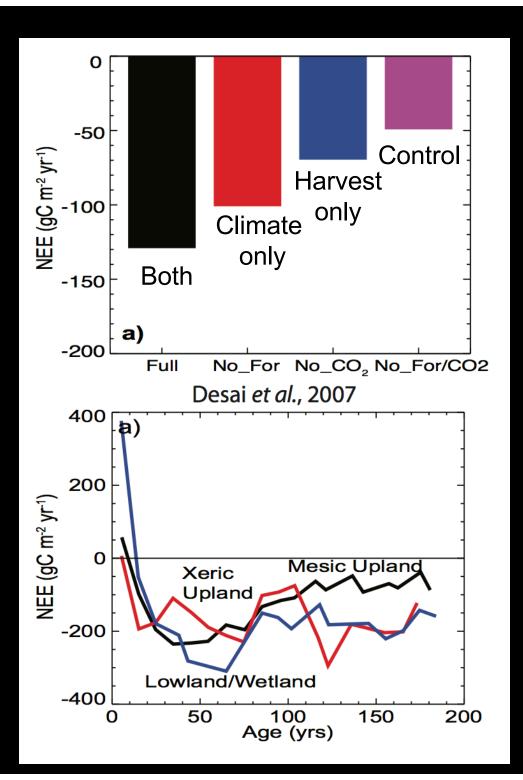


New studies in the tropics

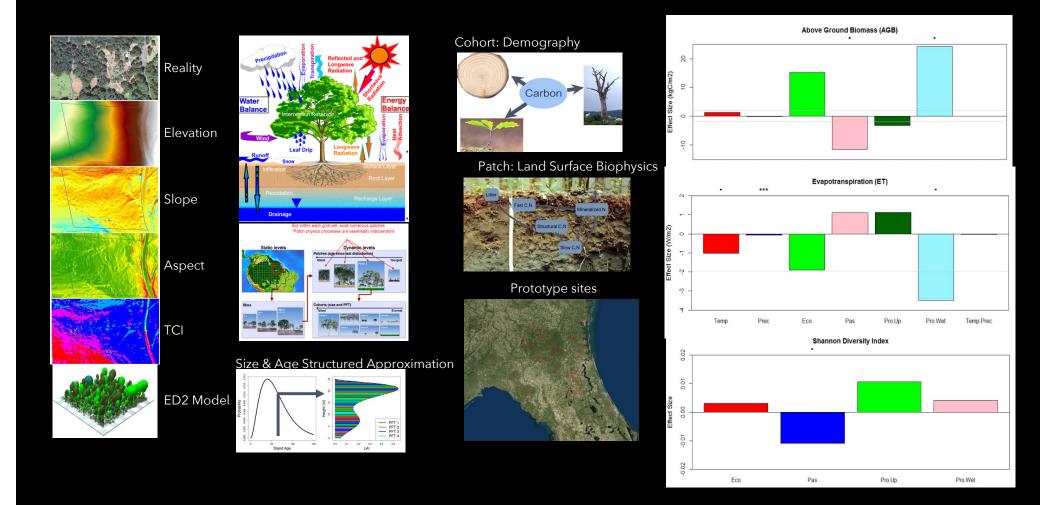


So how do we model forest management?



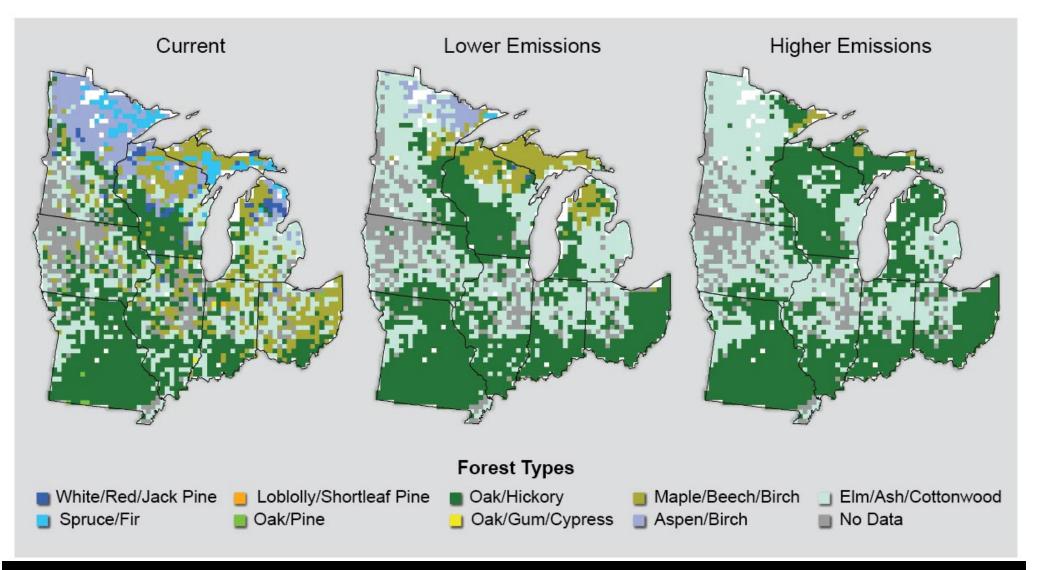


Ecosystem Demography 2 Model Preliminary Results



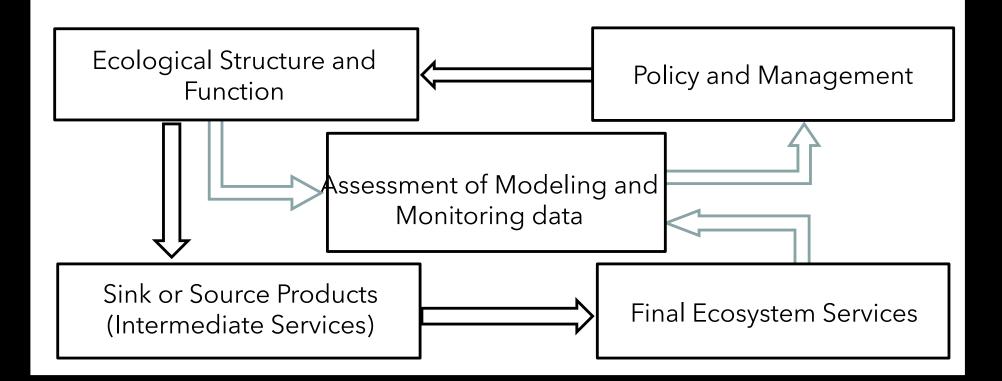
Implications and paths forward

Forest Composition Shifts



David Mladenoff, UW-Madison

Socioecological Linkages



Final thoughts

- Forest management is more than clear-cutting
- We can map it
- We can define management function in a relatively simple manner
- We are incorporating into ecosystem models
- And comparing it to real world experiments with alterative harvesting practices
- And testing hypotheses on ecological scaling and atmospheric feedbacks
- Thanks!