

# Top Ten Steps to Improve Quantification of Land-Use Change Effects of Bioenergy Systems



## CBES

Center for BioEnergy  
Sustainability

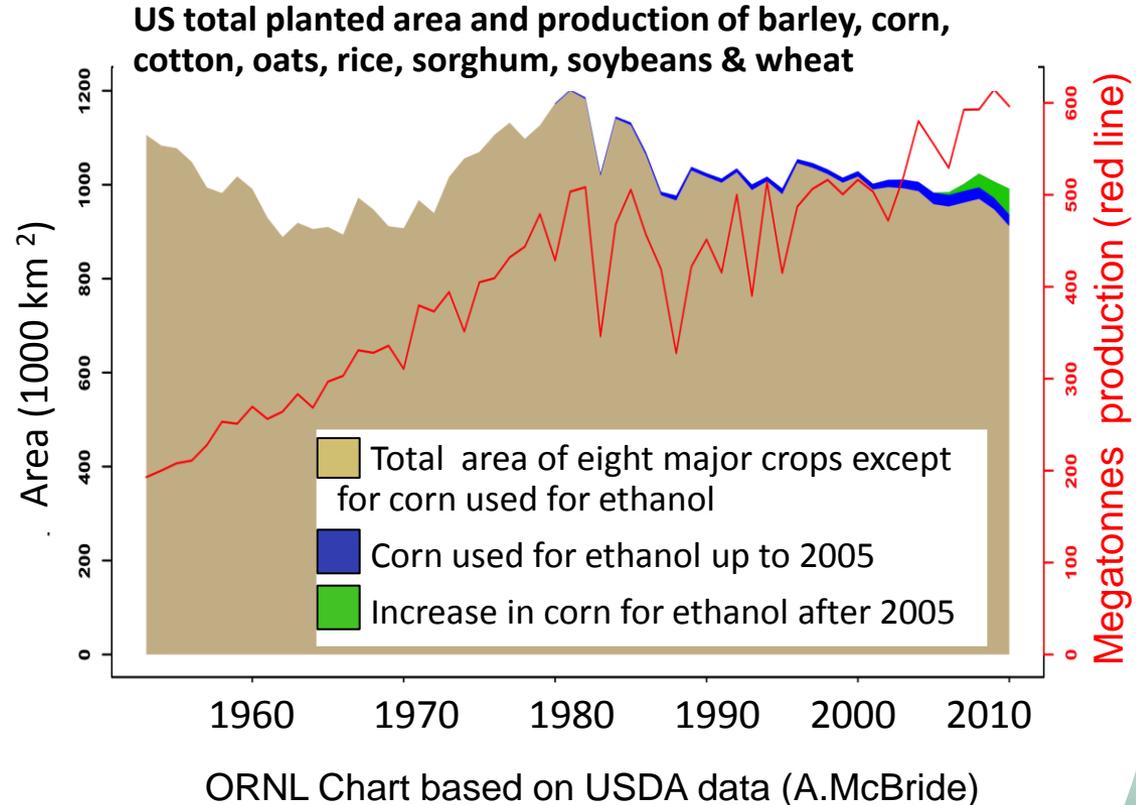
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# 1. Representation of policy in model specifications

- Shock in demand?
- Different biofuel policies have distinct land-use & economic/welfare implications
- Different ways to specify policies may have greater effects
- Policy specifications (assumptions & scenarios) must be calibrated & validated to reflect actual policies



## 2. Economic decision-making assumptions

- Perfect markets & market information assumed
- Land assumed to be privately owned & managed “rationally” to optimize profits
  - *Public land clearing is either (a) illegal or (b) policy-driven*
- Need to incorporate
  - Market failures
  - Public land issues
  - Variable effects of bioenergy policy depending on access to information, markets, tenure, security, enforcement, among others

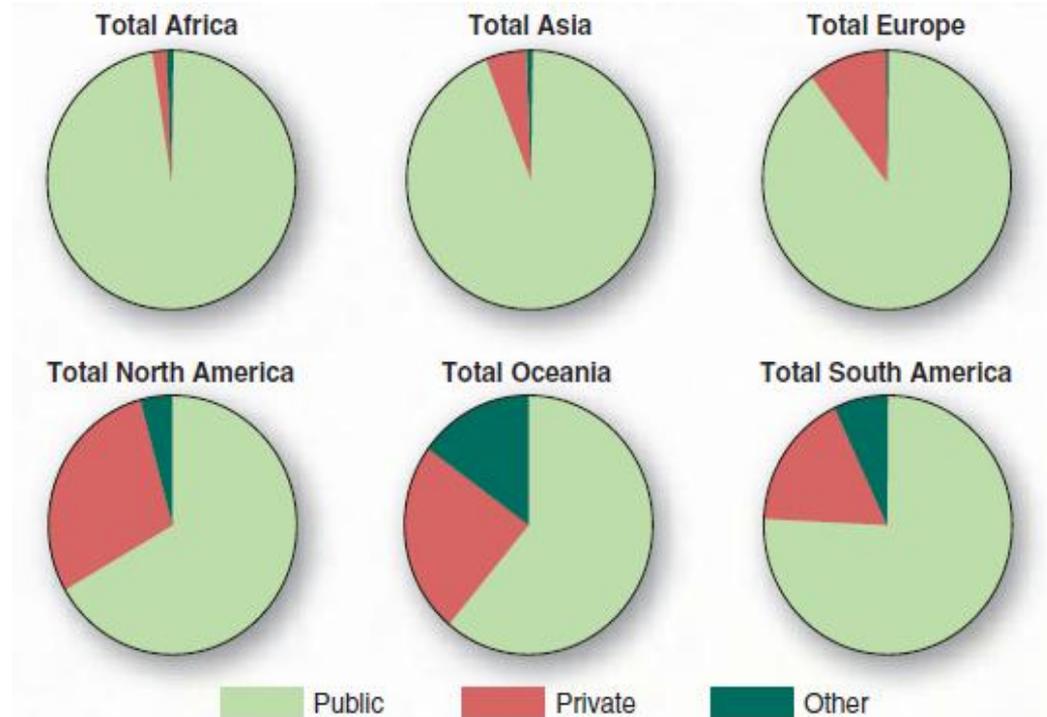
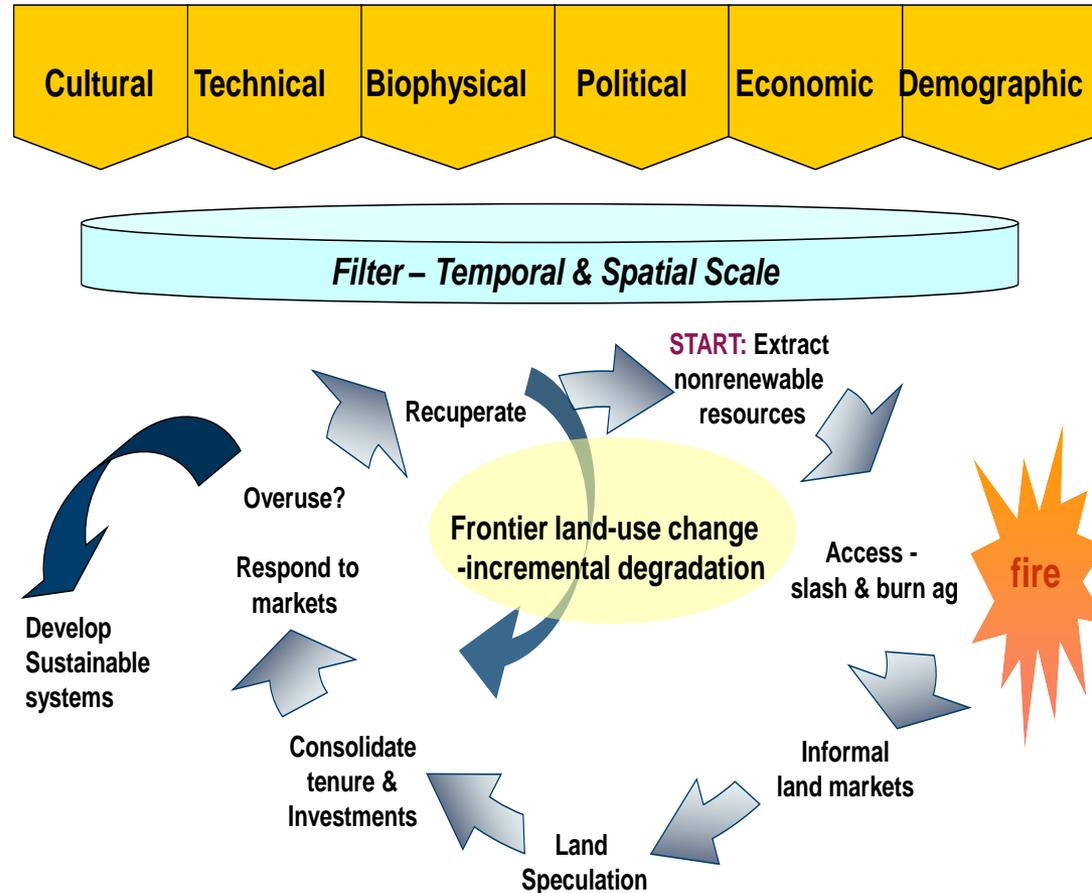


Figure: Agrawal et al., 2008, Science 320  
(based on FAO data)

# 3. Conceptual framework for drivers of initial conversion

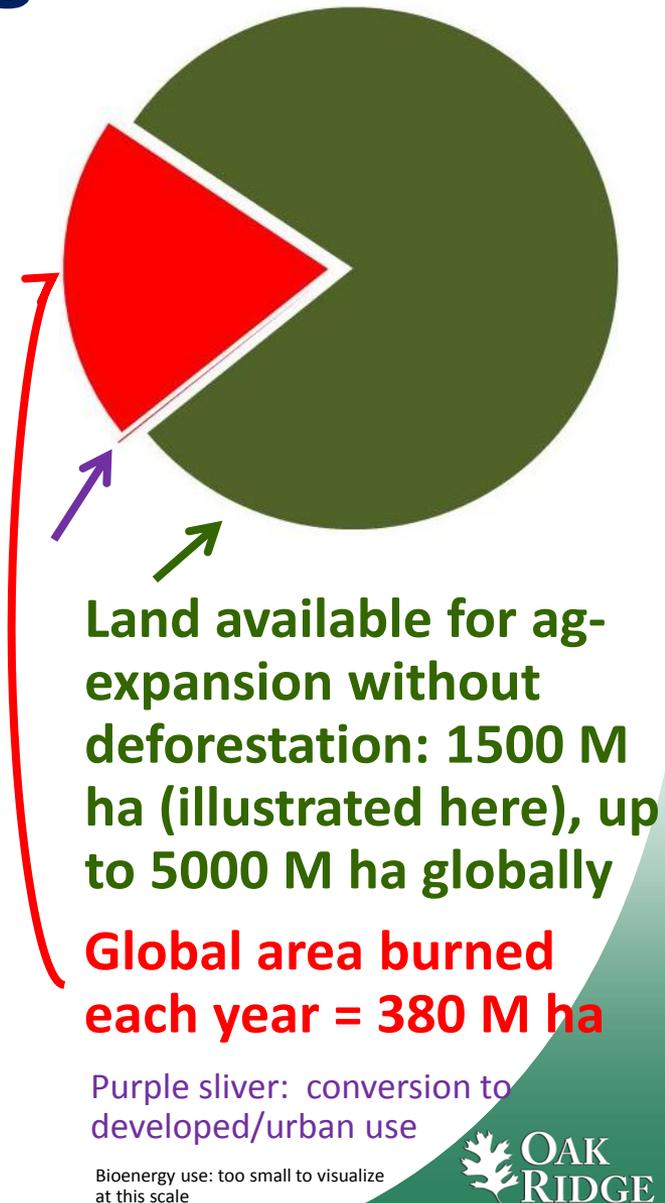
- Key drivers: **local** social, biophysical, political, legal, demographic & economic forces, yet LUC models use global price effects to estimate conversion
  - Models should reflect how bioenergy policies interact with drivers of first-time conversion at local scales
  - Should link changes at local-regional scale to global scales



- No single model adequately explains global deforestation, but empirically-based models can explain LUC at regional & local scales

# 4. Land supply & management specifications

- Models define land assets by “rents”
- Models assume land is fully & optimally used
- Need to incorporate full land supply & potential productivity
- Need to consider multiple uses, urban food production, & double or triple cropping opportunities
- Need to simulate farm-management strategies that increase production without expansion
  - Shifts in rotations
  - More efficient use of field edges, idle land
  - Adjust planting densities
  - Shifts within crop categories



# 5. Stable/static land conditions\* assumed for baseline

- Need to simulate effects relative to moving targets of gross & net change trends in land-cover & land-use\*
- Dynamics should capture changing rates, directions & types of land-cover & land-use\* at local scales
- Models need to capture historic range of variability in key land\* variables

\* ***Better land metrics and data are required***

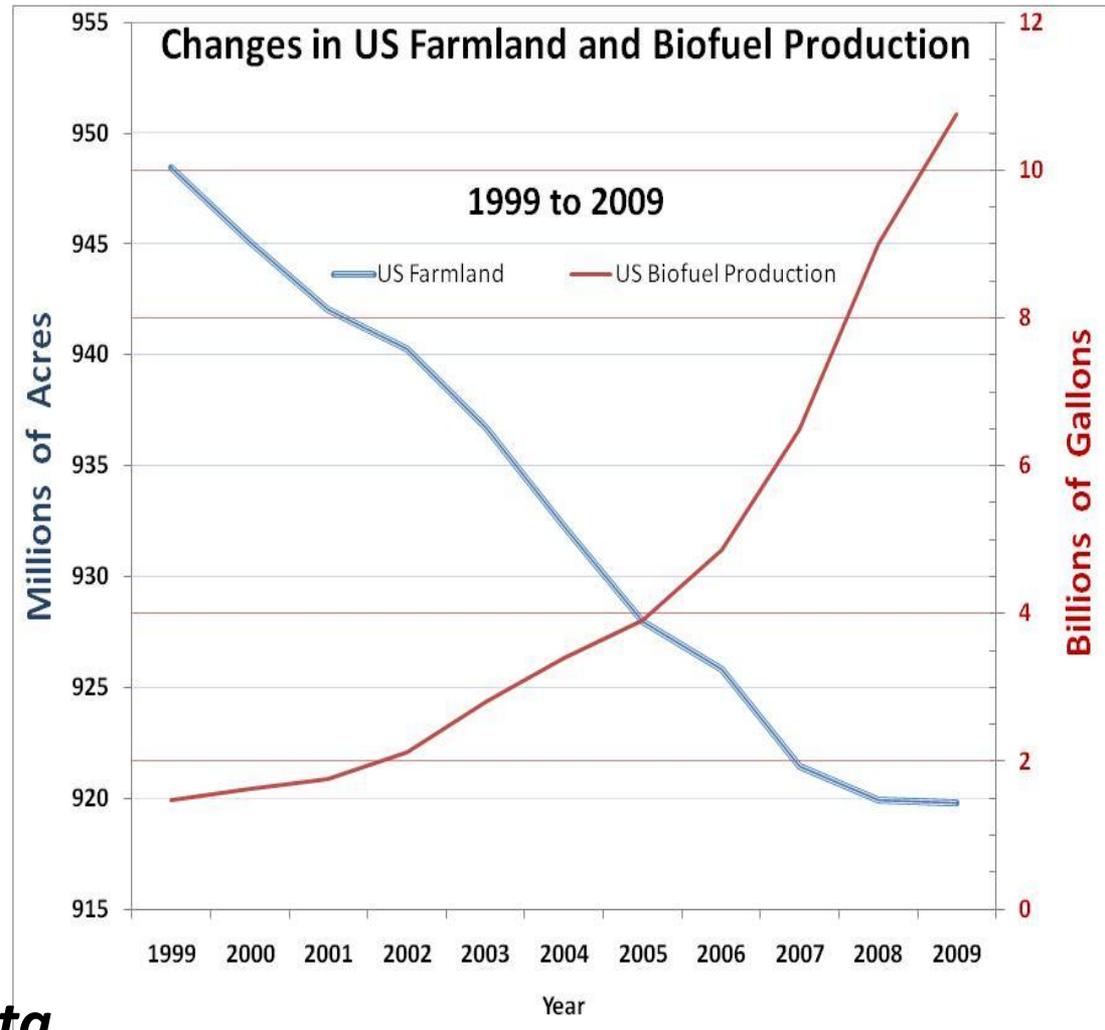
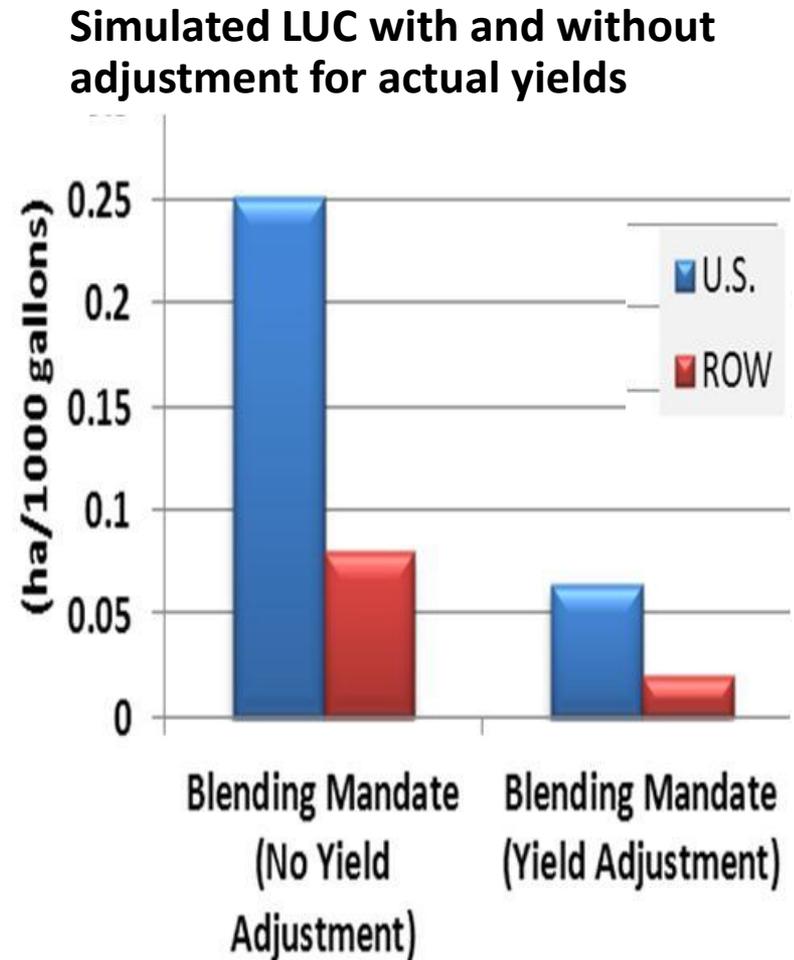


Chart by author using farmland data from USDA NASS 2010 and ethanol production data from the RFA statistics Aug 2011.

# 6. Yield change modeling

- Yields have fundamental influence on LUC estimates
- Policies & prices induce yield changes in many different ways – including geographic distribution of production of different crops
- What are effects of long-term market expectations on investments that improve efficiency and yields?
- Need accurate estimates of yield changes in response to policy



Policy simulations using GTAP-ORNL.  
Oladosu et al. 2009.

# 7. Questions of time & scale

- Choice of boundaries, resolution, data sets
- Baseline, reference case & calibration issues
- Land-use change is local, but available data are often unreliable or inconsistent at local scales
- Need high resolution & high quality temporal & spatial data for tracking changes\* at local scales

Per pixel comparison and aggregation shows no crop rotation for some areas for the Cropland Data Layer (CDL)

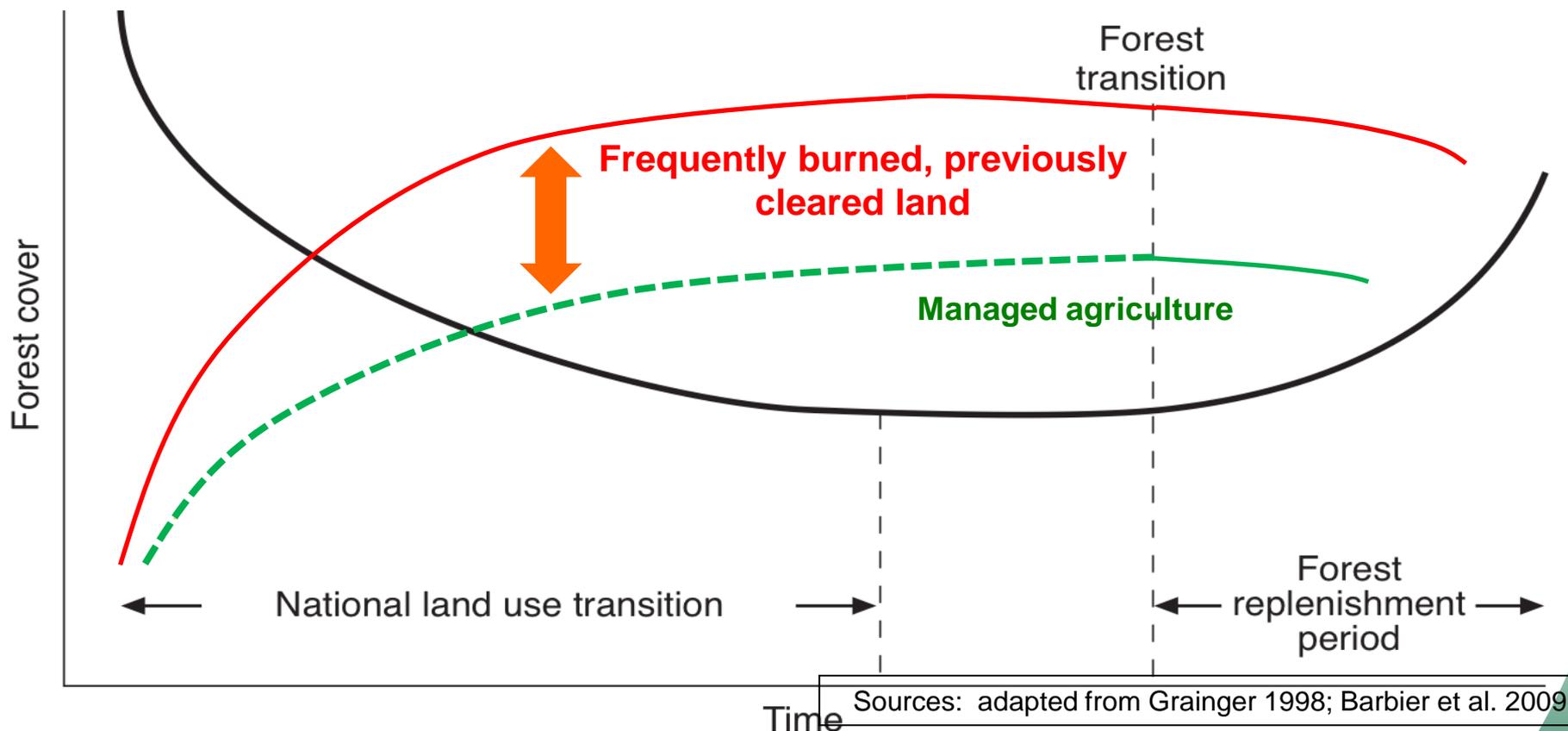


ORNL analysis, Nagendra Singh

# 8. Fire & other disturbances (and how policy/management interact with these phenomena)

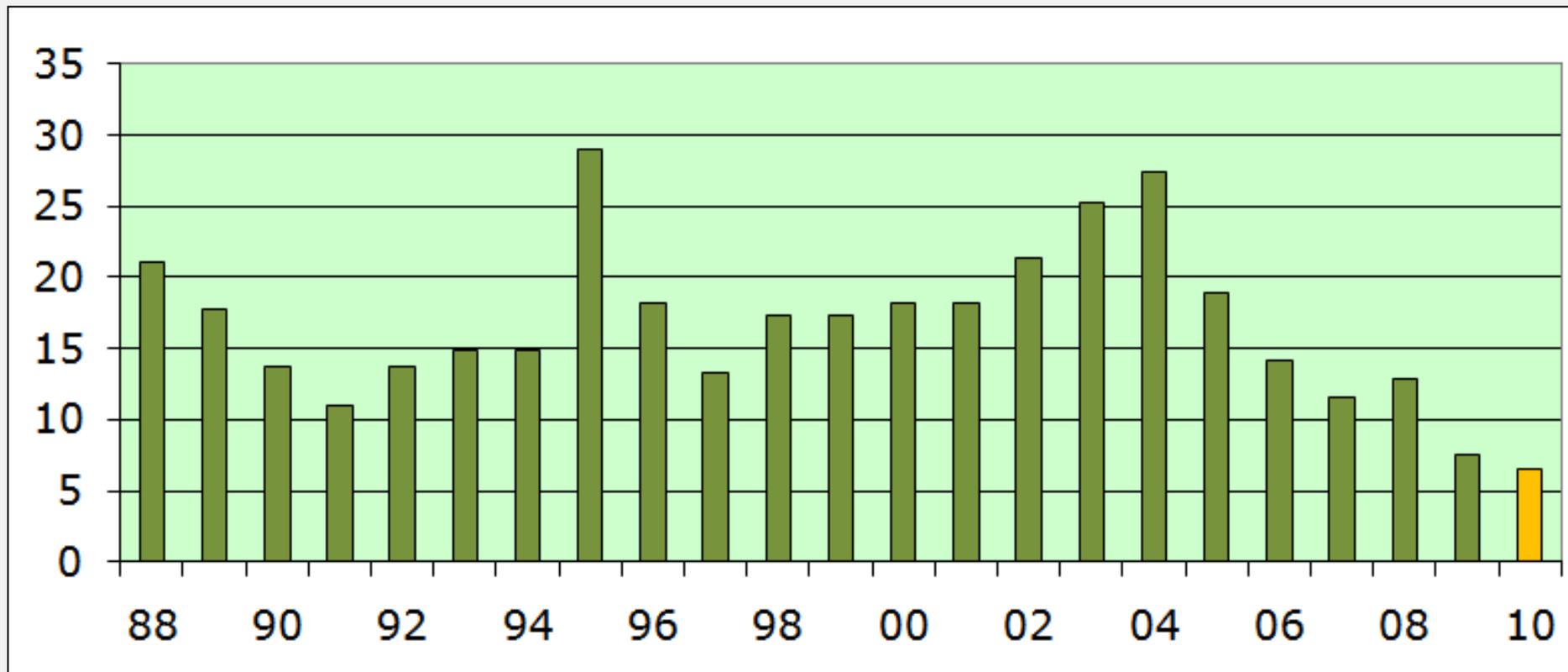


# 8. Fire & other disturbances (and how policy/management interact with these phenomena)



# 9. Correlation versus causation

- **FAO, 2010: Global tropical deforestation rate (avg. annual loss) fell > 20% compared to prior decade, led by decline in Brazil (chart below)**



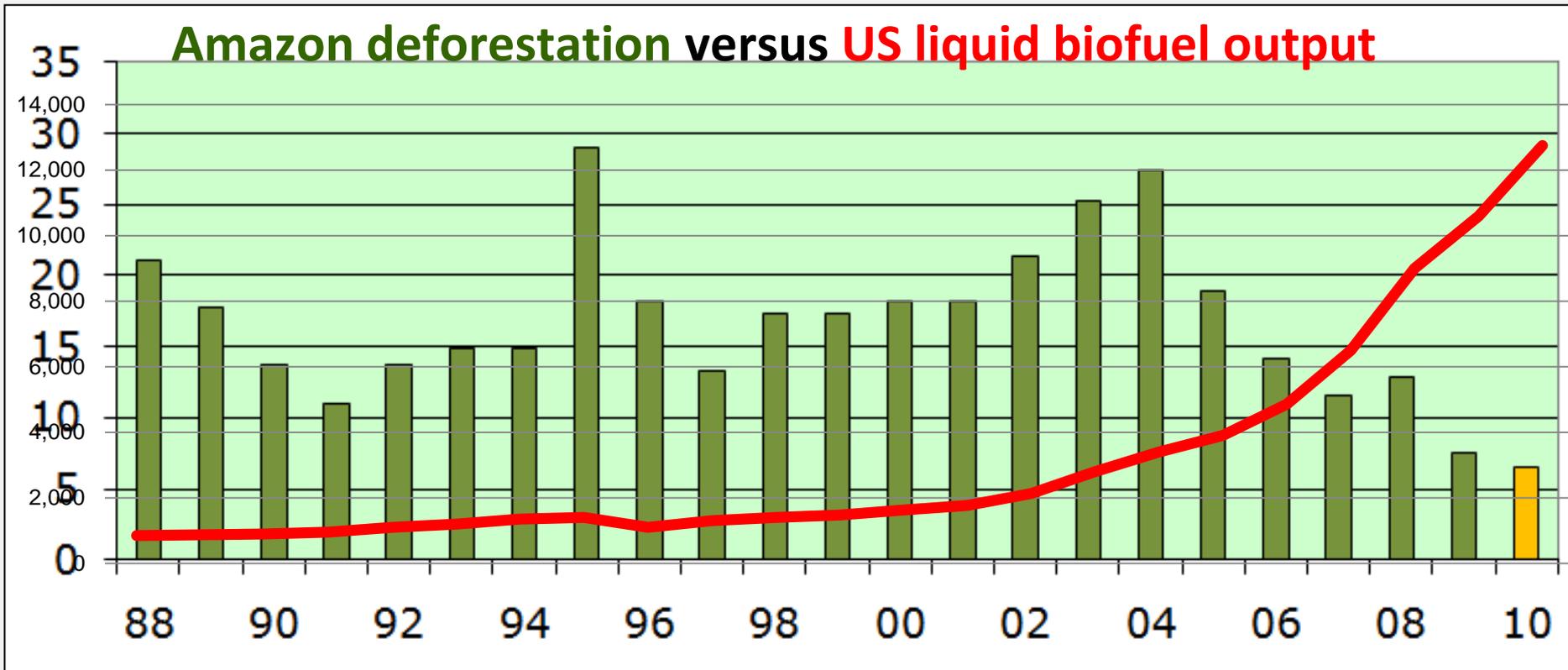
## Deforestation rate in Brazil's Amazon, thousands square km per year

Source: INPE-PRODES Brazil Space Agency: [http://www.dpi.inpe.br/gilberto/present/prodes\\_taxa2010.ppt](http://www.dpi.inpe.br/gilberto/present/prodes_taxa2010.ppt) Yellow bar for 2010 indicates preliminary result of analysis.

# 9. Correlation versus causation

- Need causal analysis of models and input assumptions
- If, when, how, and in what ways, do changes in biofuel policy affect deforestation trends?

Amazon deforestation versus US liquid biofuel output



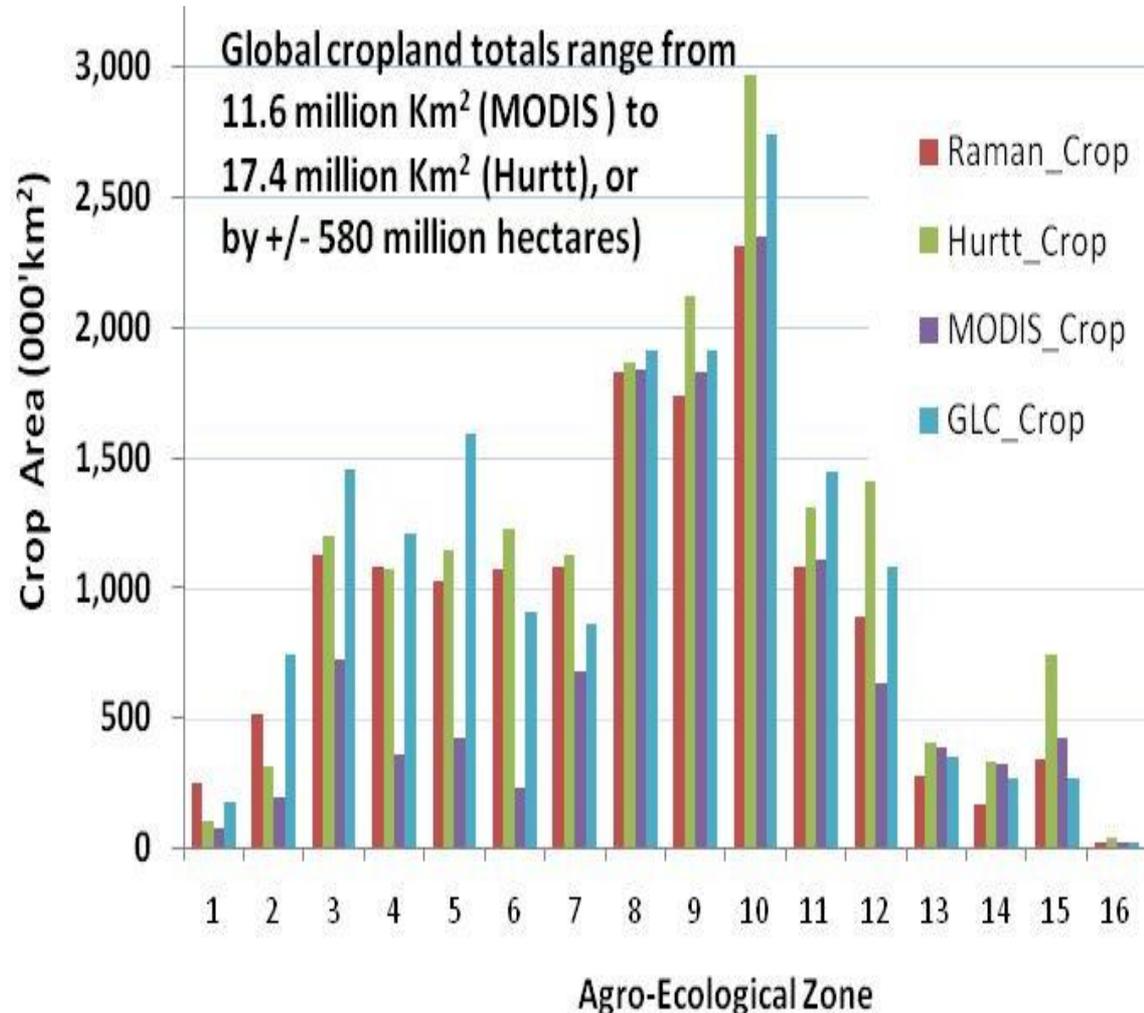
**Deforestation rate in Brazil's Amazon, thousands square km per year**

Source: INPE-PRODES Brazil Space Agency: [http://www.dpi.inpe.br/gilberto/present/prodes\\_taxa2010.ppt](http://www.dpi.inpe.br/gilberto/present/prodes_taxa2010.ppt) Yellow bar for 2010 indicates preliminary result of analysis.

# 10. Data issues

- Confusing land cover with land use
- Limitations of uses of available data
  - Classification systems
  - Remote sensing interpretations
  - Class/use definition
- Magnitude of compounding uncertainties versus magnitude of effects being modeled
- Data aggregation

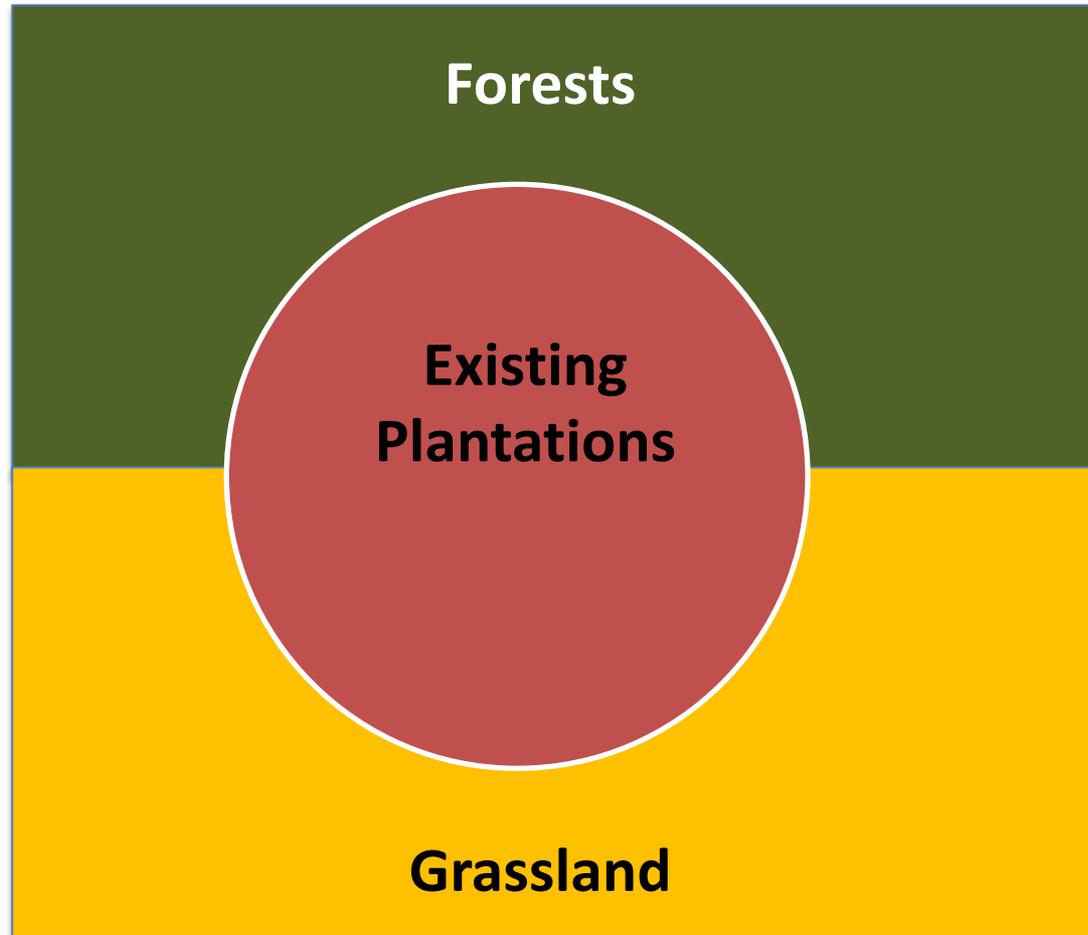
Estimates of Global Cropland circa 2000 can vary by over 100% within Agro-Ecological Zones (AEZ)



**What are effects of  
bioenergy policy on land?**

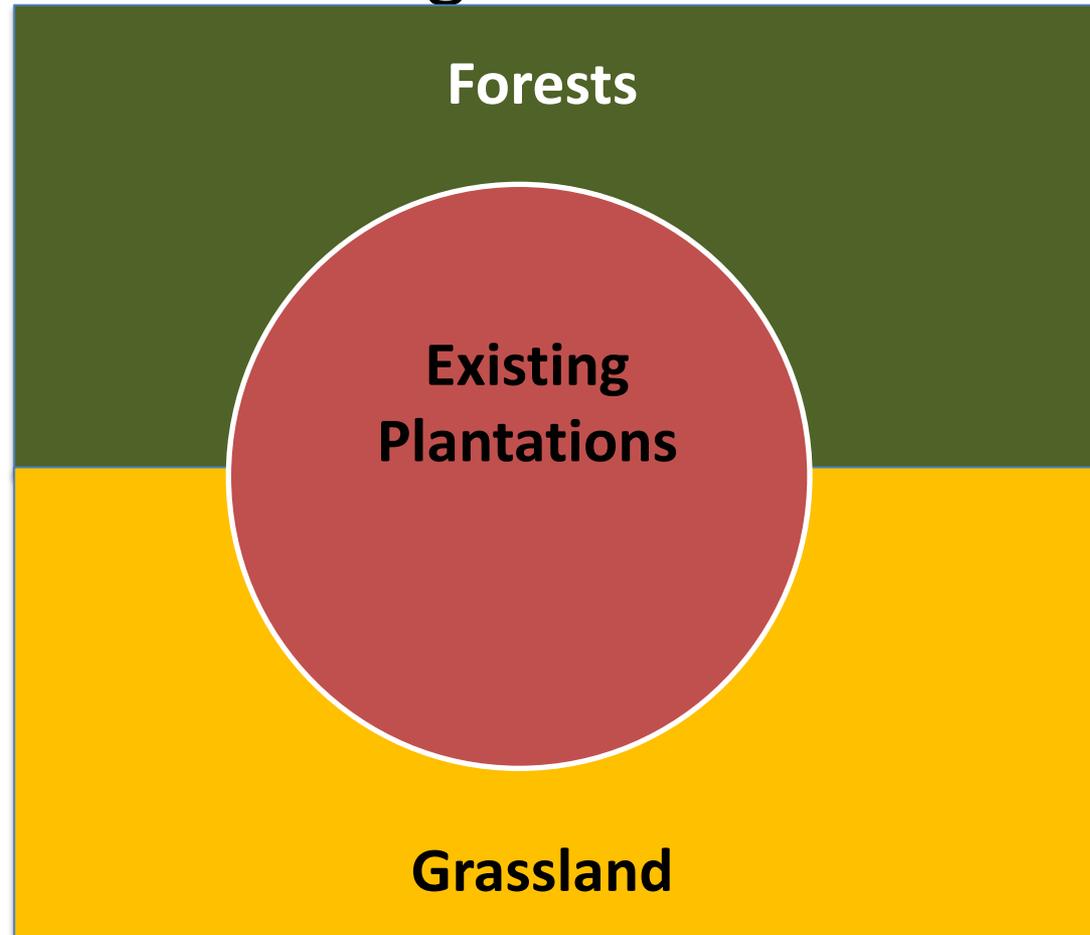
**It depends**

Models for land-use change begin with simplified representations of land cover



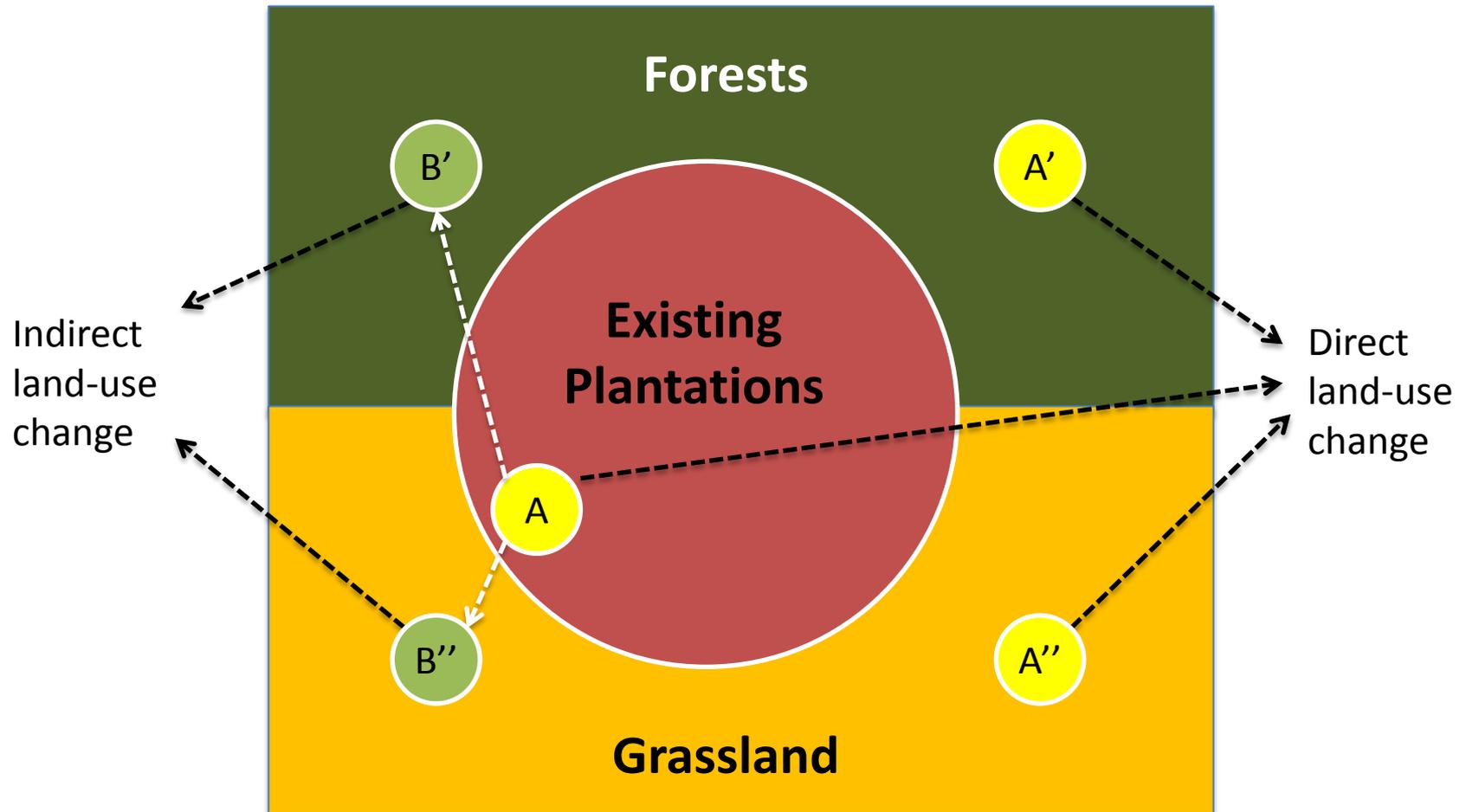
Adapted from Fritsche et al. 2011 (ILUC Study for European Parliament),  
Ecofys 2010 (Dehue), Ecofys 2011, OEKO 2010 and others

Any model that starts with this representation presumes that ILUC occurs and will merely be estimating 'how much'



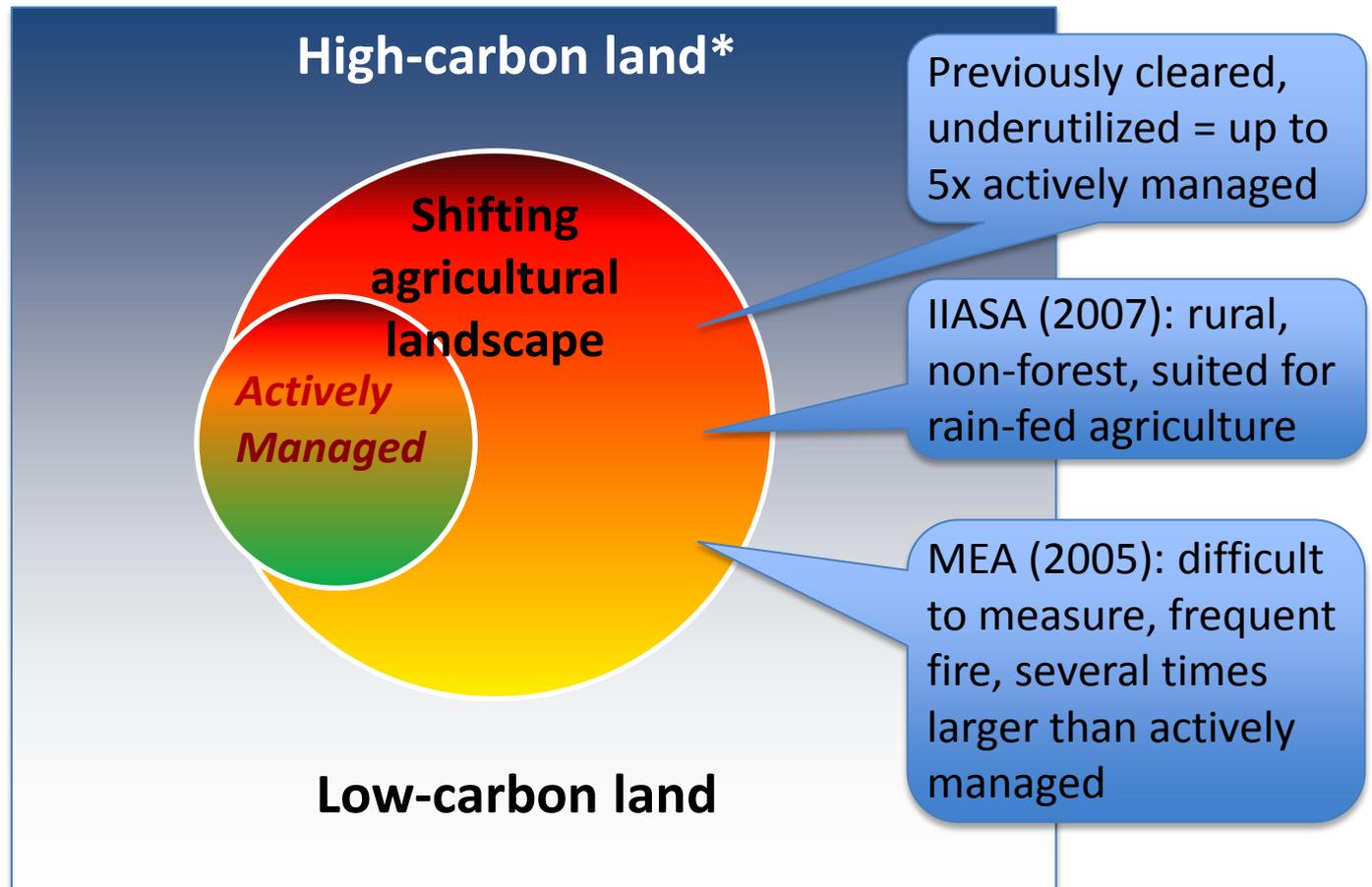
Adapted from Fritsche et al. 2011 (ILUC Study for European Parliament),  
Ecofys 2010, Ecofys 2011, OEKO 2010 and others

# Current LUC models: assumptions define direct (A) & potential indirect effects (B)



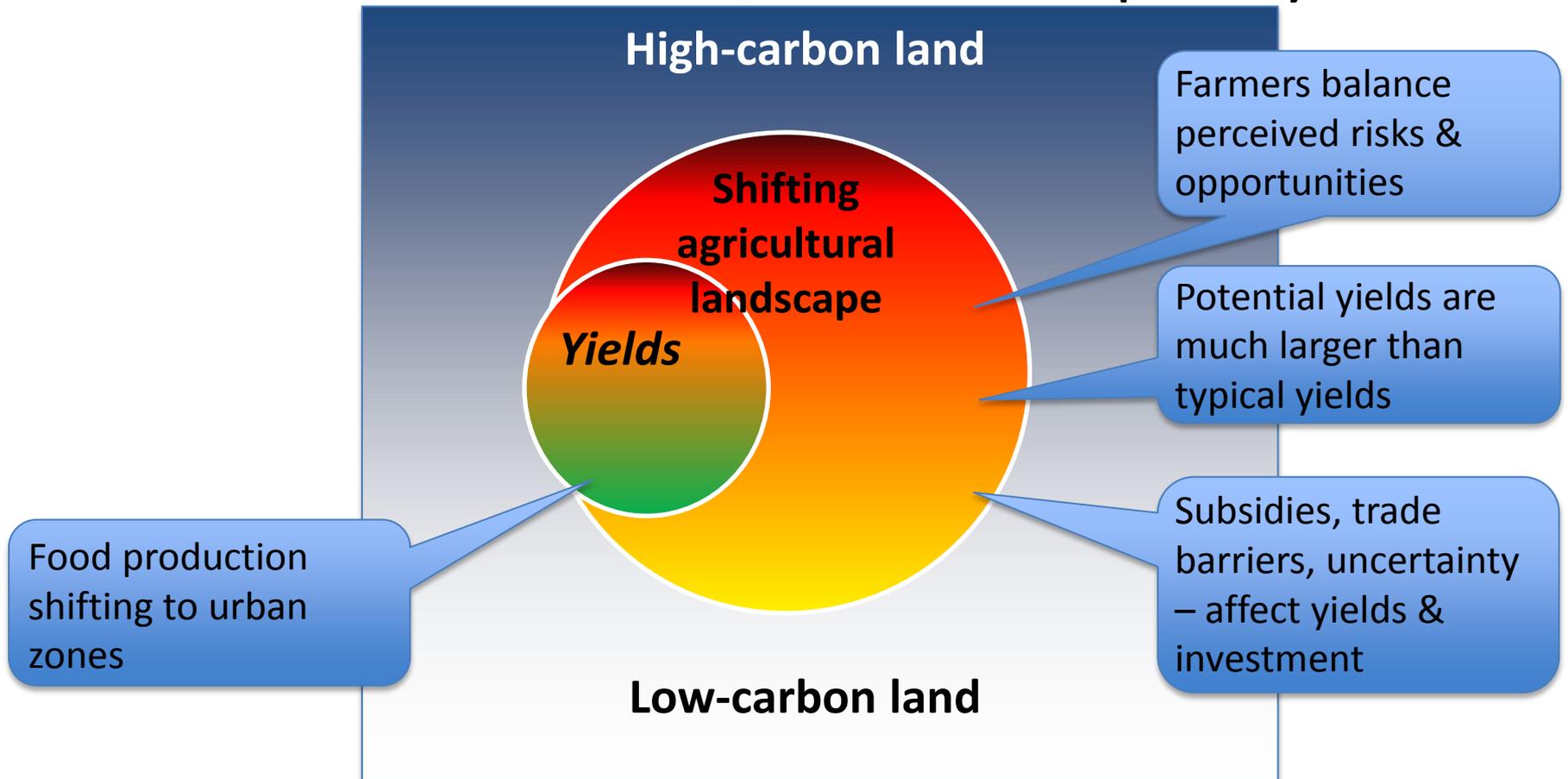
Adapted from Fritsche et al. 2011 (ILUC Study for European Parliament),  
Ecofys 2010, Ecofys 2011, OEKO 2010 and others

# Difficult to represent complex dynamics of observed land cover & land use changes

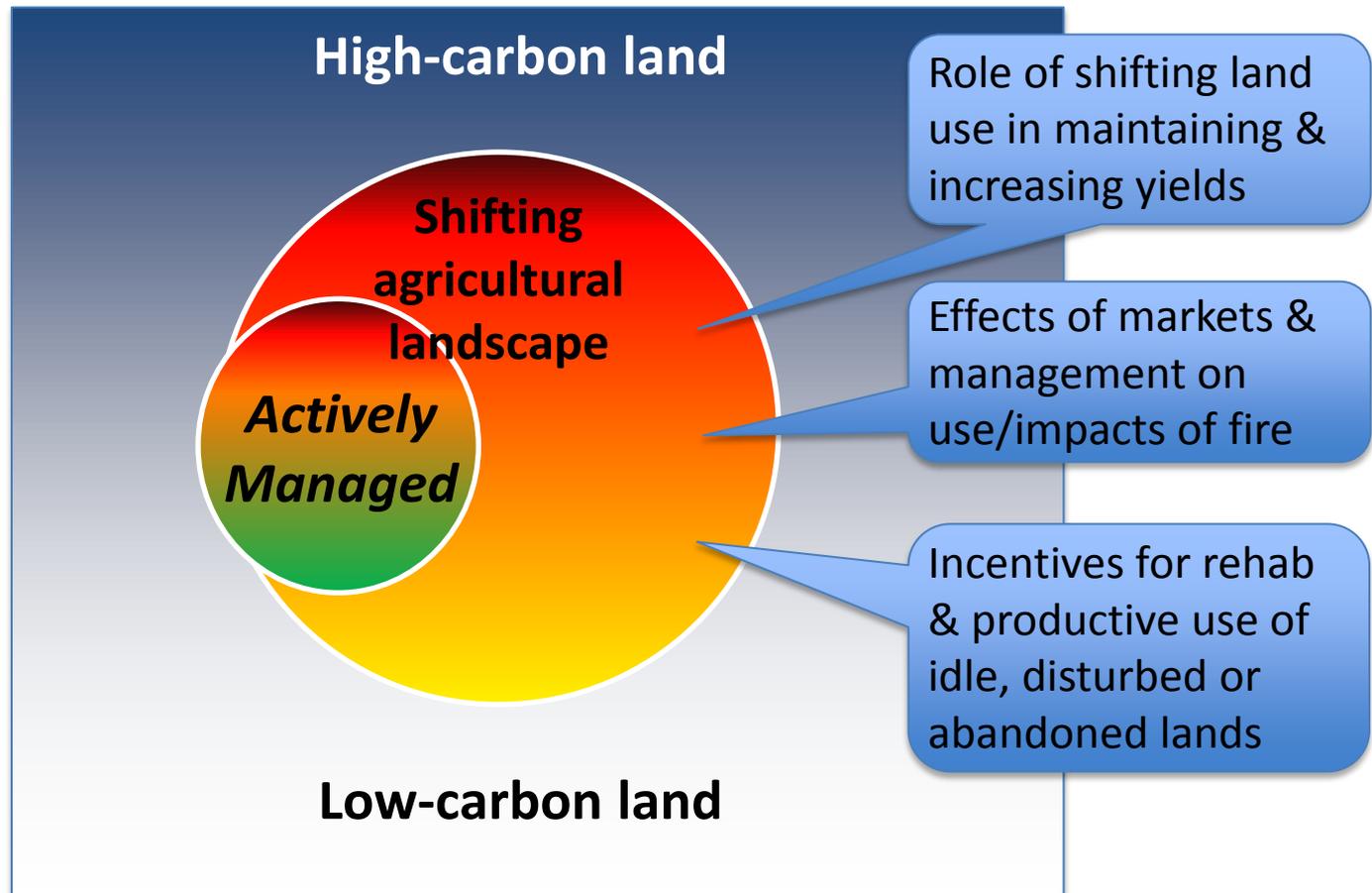


\*Nutrient cycling, productivity, environmental services – stocks, flows & potential capacity – all important (not just carbon)

# Definitions of “land use,” changing yields, urbanization trends, add to complexity



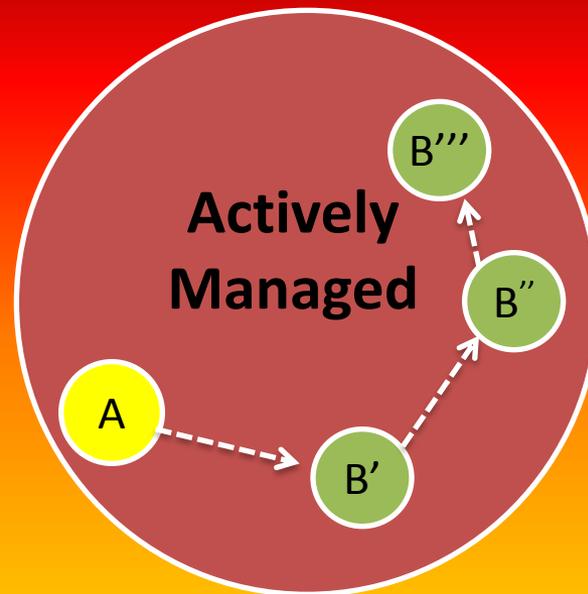
Many data needs (spatial, temporal) for more accurate representation of historic trends



Let's focus on the shifting agricultural landscape...

# Interactions among new markets & product diversification are complex

## Shifting Agricultural Landscape



As observed in U.S.:

Net changes:  
reduced cotton,  
sorghum  
pasture;  
reduced rate of  
farmland loss

More double-  
crops; higher  
yields

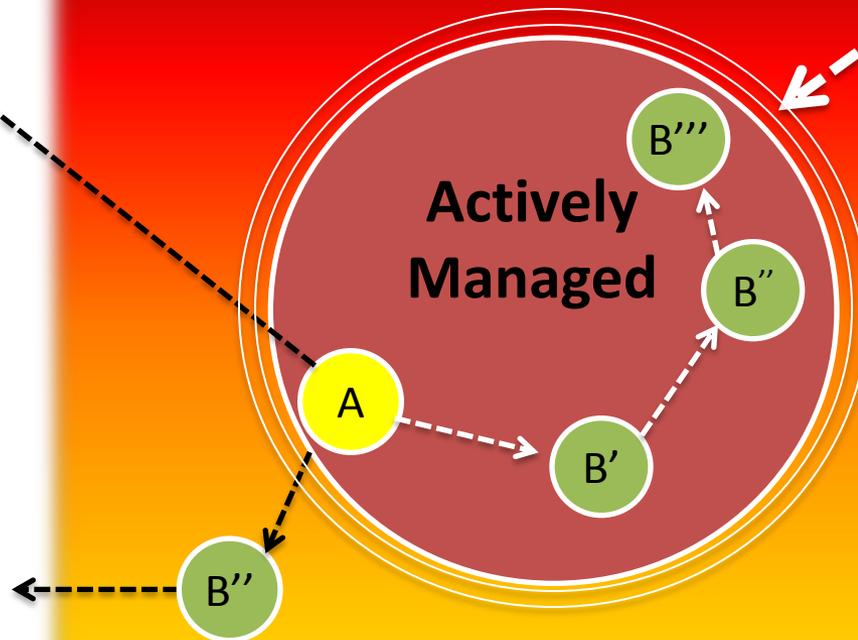
Displacement  
of idle land &  
lower yield  
grains –  
increased  
feed/DDGs  
exports

# Interactions among new markets & product diversification are complex

*Maintenance of productive farmland: LUC or "change avoidance?"*

What are policy effects outside US on historic trends – e.g. use of shifting agriculture and use of fire?

## Shifting Agricultural Landscape



(Circle gets smaller ) Actual net change includes continued loss of farmland, although at slower rate than pre-bioenergy policy

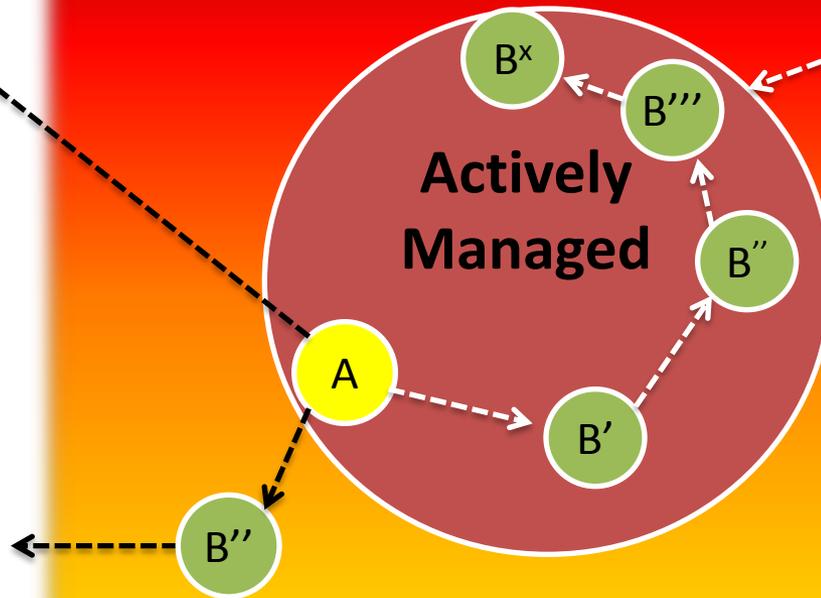
"LUC": Use of idle land, double crops, displacement of lower yield grains...

# Interactions among new markets & product diversification are complex

## Shifting Agricultural Landscape

Maintenance of productive farmland – LUC or change avoidance?

What are policy effects outside US on historic trends in shifting ag landscapes & use of fire?



*Indirect effects likely include acceleration of historic trends toward higher efficiency, higher returns and higher yields*

# Summary: Top Ten Improvements

1. Representation of policy in model specifications
2. Economic decision-making assumptions
3. Conceptual framework for drivers of initial conversion
4. Land supply & management specifications
5. Assumed land use dynamics (scenarios, baseline choice)
6. Modeling yield change
7. Issues of time, scale
8. Fire & other disturbances
9. Correlation versus causation
10. Many data issues to resolve



# Thank you!

<http://www.ornl.gov/sci/besd/cbes>

- **Reports**
- **Forums**
- **Other presentations**
- **Recent publications**



This research was supported by the U.S. Department of Energy (DOE) under the Office of the Biomass Program and performed at Oak Ridge National Laboratory (ORNL). Oak Ridge National Laboratory is managed by the UT-Battelle, LLC, for DOE under contract DE-AC05-00OR22725. The views in this presentation are those of the author, who is responsible for any errors or omissions.



# Extra slides and References

# Review of Land Use and Yield Change

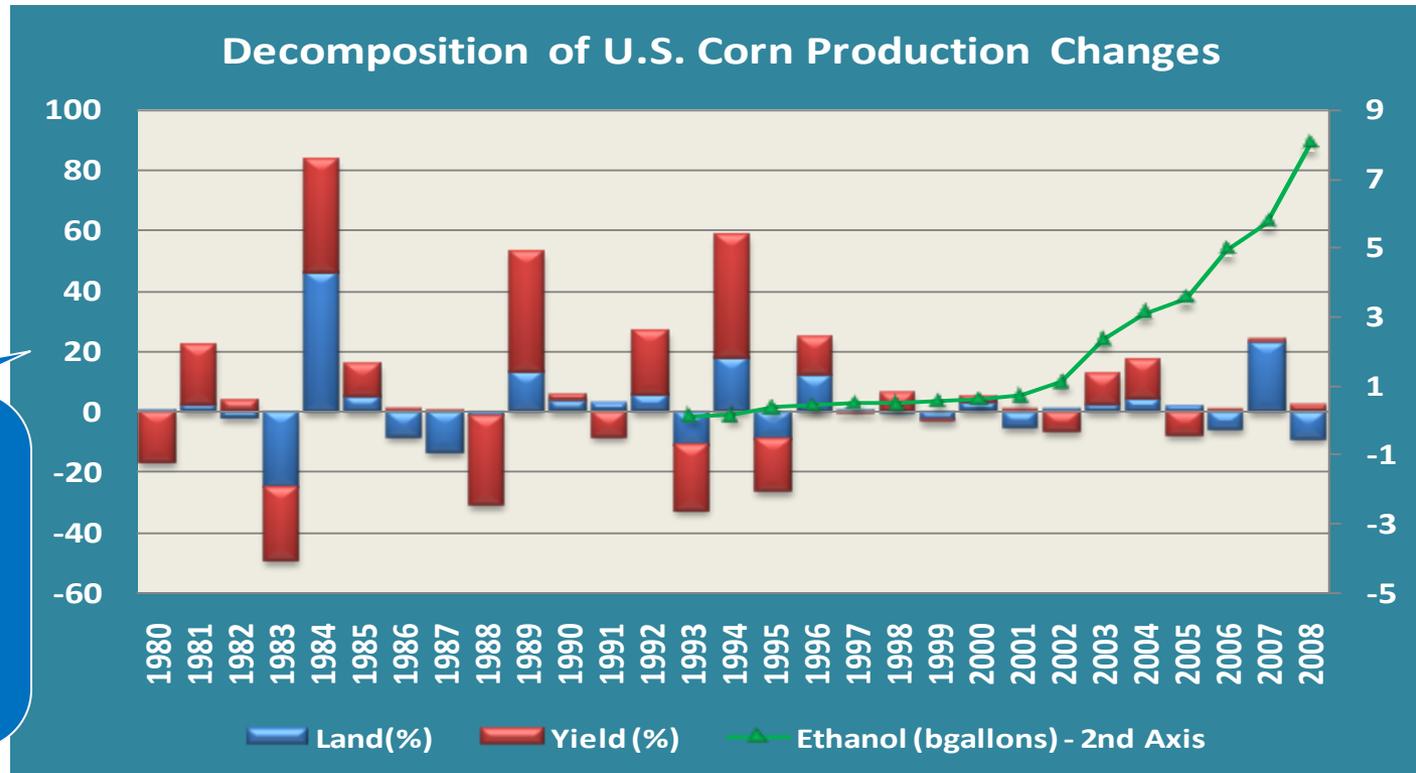
Production equation:

$$Q = Y.L$$

Decomposition:

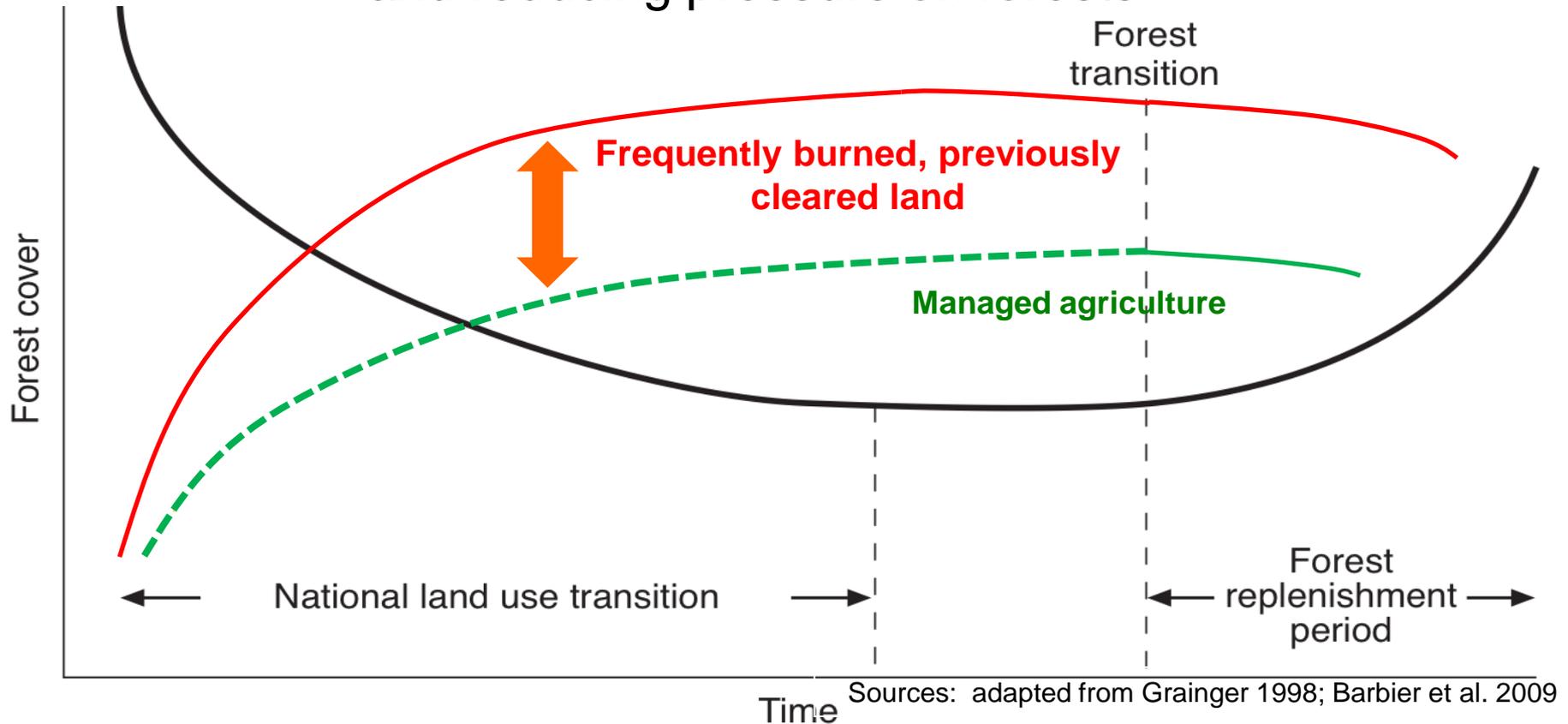
$$\frac{\Delta Q}{Q} = \frac{\Delta Y}{Y} + \frac{\Delta L}{L}$$

Note changes in volatility over time. Also, land and yield contribution tend to change in the same direction



- Yield contribution to growth in production is substantial
- Since 2001, land share exceeds yield share in only 3 years\*
  - 2002 & 2005 were both years of net negative output growth
  - 2007 positive output growth dominated by land increase

ILUC effects may be opposite of those assumed in current models – bringing previously cleared lands into productive use and reducing pressure on forests



- FIRE is a management tool for large areas of previously cleared, under-utilized land.
- 330-430 million hectares burn each year (Giglio et al. 2010)

# Selected References

- Agrawal et al., 2008. A. Agrawal, A. Chhatre and R. Hardin, Changing governance of the world's forests, *Science* 320 (2008)
- Barbiera, E.B., Burgess, J.C., Grainger A. 2009. The forest transition: Towards a more comprehensive theoretical framework. *Land Use Policy* 27 (2010) 98–107.
- Dale, V.H., Kline, K.L., Wright, L.L., Perlack, R.D., Downing, M., Graham, R.L. 2011. Interactions among bioenergy feedstock choices, landscape dynamics and land use. *Ecological Applications* 21(4):1039-1054.
- Dale V.H., Efroymsen R.A. and Kline K.L. 2011. The land use – climate change – energy nexus. *Landscape Ecology* 26(6):755-773.
- Diaz-Chavez R, Mutimba S, Watson H, Rodriguez-Sanchez S and Nguer M. 2010. Mapping Food and Bioenergy in Africa. A report prepared on behalf of FARA. Forum for Agricultural Research in Africa, Ghana.
- EC 2010. The impact of Land Use Change on Greenhouse Gas Emissions from Biofuels and Bioliquids - Literature review. July 2010 (in-house review conducted for DG Energy as part of the European Commission's analytical work on indirect land use change)
- Ecofys 2010: Indirect effects of biofuel production - Overview prepared for GBEP; report by Bart Dehue; Utrecht.
- FAO 2010. SOFI Report: State of Food Insecurity in the World: <http://www.fao.org/publications/sofi/en/>
- FAO 2010c. Forestry Paper 163, Global Forest Resources Assessment, 2010, Main Report. Food and Agriculture Organization of the United Nations (FAO) Rome. ISBN 978-92-5-106654-6
- FAO 2009a. Hunger in the Face of Crisis: Global Economic Slowdown Underscores Urgency of Addressing Long-Term Challenges. [http://www.fao.org/economic/es-policybriefs/briefs-detail/en/?no\\_cache=1&uid=35540](http://www.fao.org/economic/es-policybriefs/briefs-detail/en/?no_cache=1&uid=35540) Economic and Social Perspectives, Policy Brief #6. September 2009. This and other policy briefs at <http://www.fao.org/economic/es-policybriefs>
- FAO. 2009b. The State of Food Insecurity in the World. <http://www.fao.org/publications/sofi>
- FAO-IIASA (2007). "Mapping biophysical factors that influence agricultural production and rural vulnerability." Food and Agriculture Organization and International Institute for Applied Systems Analysis, Rome 2007.
- Feddema J.J., K. Oleson, G. Bonan, L. Mearns, W. Washington, G. Meehl, D. Nychka (2005). A comparison of a GCM response to historical anthropogenic land cover change and model sensitivity to uncertainty in present-day land cover representations, *Climate Dynamics*, 25: 581-609.
- Feddema, Johannes. University of Kansas (KU), Geography Dept. faculty home page (accessed January 24, 2011). [http://www2.ku.edu/~geography/peoplepages/Feddema\\_J.shtml#research](http://www2.ku.edu/~geography/peoplepages/Feddema_J.shtml#research)

# References (pg 2)

- Feddema, J.J., K. Oleson, G. Bonan, L.O. Mearns, L. Buja, W.M. Washington, and G. Meehl. (2005). How important is land cover change for simulating future climates? *Science* 310(5754): 1674-1678.
- Friedlingstein et al. 2010. Update on CO2 emissions (P. Friedlingstein, R. A. Houghton, G. Marland, J. Hackler, T. A. Boden, T. J. Conway, J. G. Canadell, M. R. Raupach, P. Ciais, C. Le Quéré). *Nature Geoscience*, Vol. 3, Pg: 811–812. DOI: doi:10.1038/ngeo1022
- Fritsche, U.R., and Wiegmann K., 2011. Indirect Land Use Change and Biofuels-STUDY (IP/A/ENVI/ST/2010-15) for European Parliament Committee on Environment, Public Health and Food Safety. Brussels.  
<http://www.europarl.europa.eu/activities/committees/studies.do?language=EN>
- Giglio L., J. T. Randerson, G. R. van derWerf, P. S. Kasibhatla, G. J. Collatz, D. C. Morton, and R. S. DeFries. Assessing variability and long-term trends in burned area by merging multiple satellite fire products. *Biogeosciences*, 7, 1171–1186, 2010.
- Gilbert C. L. and C. W. Morgan. 2010. Food price volatility. *Philos Trans R Soc Lond B Biol Sci*. 2010 September 27; 365(1554): 3023–3034. doi: 10.1098/rstb.2010.0139.
- Gilbert C. L. 2010a. How to understand high food prices. *J. Agric. Econ.* 61, 398–425
- Grainger, A. 1998: Modelling tropical land use change and deforestation. In Goldsmith B. ed. *Tropical Rain Forests, a Wider Perspective*. Chapman and Hall, London, 302-344.
- Grainger A. 2008: Difficulties in tracking the long-term global trend in tropical forest area. *Proceedings of the National Academy of Sciences USA* 105, 818-823. Greene, D.L., Leiby, P.N., 2006. The Oil Security Metrics Model, ORNL/TM-2006/505, Oak Ridge National Laboratory, Oak Ridge, TN. [http://cta.ornl.gov/cta/Publications/Reports/ORNL\\_TM\\_2006\\_505.pdf](http://cta.ornl.gov/cta/Publications/Reports/ORNL_TM_2006_505.pdf)
- Greene, D.L., Measuring energy security: Can the United States achieve oil independence? *Energy Policy* (2009), doi:10.1016/j.enpol.2009.01.041
- Hansen J, Sato M, Kharecha P, Beerling D, Berner R, Masson-Delmotte V, Pagani M, Raymo M, Royer DL, Zachos JC. 2008. Target atmospheric CO2: Where should humanity aim? *Open Atmospheric Science Journal* 2: 217–231.
- Hertel, T.W., A. Golub, A.D. Jones, M. O’Hare, R.J. Plevin and D.M. Kammen, “Effects of US Maize Ethanol on Global Land Use and Greenhouse Gas Emissions: Estimating Market mediated Responses”, *BioScience*, Vol. 60 No. 3, March 2010.

# References (pg 3)

- Hecht, AD, D Shaw, R Bruins, V Dale, K Kline, A Chen. 2009. Good policy follows good science: Using criteria and indicators for assessing sustainable biofuels production. *Ecotoxicology* 18(1)
- INPE-PRODES Brazil Space Agency: [http://www.dpi.inpe.br/gilberto/present/prodes\\_taxa2010.ppt](http://www.dpi.inpe.br/gilberto/present/prodes_taxa2010.ppt) Accessed January 27, 2011.
- IMF 2011: Cevik Serhan and Tahsin Saadi Sedik. A Barrel of Oil or a Bottle of Wine: How Do Global Growth Dynamics Affect Commodity Prices? IMF Working Paper (WP 11/1), Middle East and Central Asia Department. January, 2011
- Kline K. et al. 2011. Collaborators welcome: Global Sustainable Bioenergy Project (GSB). GLP NEWS No. 7 (7-8). The article reviews recent collaborations among ORNL, PNL and others in research supporting the GSB. See <http://www.globallandproject.org/newsletter.shtml>
- Kline KL, GA Oladosu, VH Dale, and AC McBride. (In press; 2011). Scientific analysis is essential to assess biofuel policy effects: In response to the paper by Kim and Dale on "Indirect land use change for biofuels: Testing predictions and improving analytical methodologies." *Biomass and Bioenergy*.
- Kline KL, Dale VH, Grainger A. 2010. Challenges for Bioenergy Emission Accounting. *Science e-letter*. (2 March 2010)
- Kline KL, Dale VH, Lee R, Leiby P. 2009. In Defense of Biofuels, Done Right. *Issues in Science and Technology* 25(3): 75-84. <http://www.issues.org/25.3/kline.html>
- Kline and Dale. 2008. *Science* 321:199-200.
- Lal R. 2004. Soil carbon sequestration impacts on global climate change and food security. *Science* 304: 1623–1627.
- Lal R. 2006. Enhancing crop yield in the developing countries through restoration of the soil organic carbon pool in agricultural lands. *Land Degradation and Development* 17: 197–209.
- Lal, Rattan. 2010. Managing Soils and Ecosystems for Mitigating Anthropogenic Carbon Emissions and Advancing Global Food Security. *BioScience* 60: 708-721.
- Le Quéré, C. et al. *Nature Geosci.* 2, 831–836 (2009).
- National Commission on Energy Policy, 2004. Ending the Energy Stalemate: A Bipartisan Strategy to Meet America's Energy Challenges.

# References (pg 4)

- OEKO (Oeko-Institut – Institute for Applied Ecology) 2010: The "iLUC Factor" as a Means to Hedge Risks of GHG Emissions from Indirect Land Use Change Associated with Bioenergy Feedstock Production; Fritsche, Uwe R./Hennenberg, Klaus/Hünecke, Katja; prepared for BMU; Darmstadt <http://www.oeko.de/oekodoc/1030/2010-082-en.pdf>
- Oladosu G and K Kline.2010. The Role of Modeling Assumptions and Policy Instruments in Evaluating the Global Implications of U.S. Biofuel Policies. Presented at the 33rd IAEE International Conference “The Future of Energy: Global Challenges, Diverse Solutions” Rio de Janeiro, Brazil, June 6-9, 2010.
- Oladosu G., K. Kline, R. Martinez and L. Eaton. 2011. Sources of Corn for Ethanol Production in the United States: A Review and Decomposition Analysis of the Empirical Data. DOI: 10.1002/bbb.305; *Biofuels, Bioprod. Bioref.*
- Oxfam 2010. Hunger in the Sahel: A permanent emergency? Oxfam Briefing Note (Etienne du Vachat; Eric Hazard) 15 December 2010. [http://www.oxfam.org.uk/resources/policy/conflict\\_disasters/downloads/bn-hunger-in-the-sahel-15122010-en.pdf](http://www.oxfam.org.uk/resources/policy/conflict_disasters/downloads/bn-hunger-in-the-sahel-15122010-en.pdf) Accessed January 24, 2011.
- Ramankutty N., et al., “Farming the Planet: 1. Geographic distribution of global agricultural lands in the year 2000” and Monfreda C. et al., “Farming the Planet: 2. Geographic distribution of crop areas, yields, physiological types, and net primary production” both in: *Glob. Biogeochemical Cycles* 22, GB1022, March 2008.
- RFA 2010. Renewable Fuels Association, Industry statistics: <http://www.ethanolrfa.org/industry/statistics/>
- Thurow R., Kilman S. 2009. Enough: why the world's poorest starve in an age of plenty. New York: Perseus Books Group, for Public Affairs.
- Tyner, W.E., F. Taheripour, Q. Zhuang, D. Birur and U. Baldos, "Land Use Changes and Consequent CO2 Emissions due to US Corn Ethanol Production: A Comprehensive Analysis", 2010
- UNCTAD 2009. The 2008 Food Price Crisis: Rethinking Food Security Policies. G-24 Discussion Paper Series No. 56, June 2009. by Anuradha Mittal for the United Nations Conference on Trade and Development (UNCTAD).
- USDA NASS 2010. USDA 2010: “Farms, Land in Farms, and Livestock Operations 2009 Summary: Released February 12, 2010, by the National Agricultural Statistics Service (NASS), Agricultural Statistics Board, U.S. Department of Agriculture.”
- USDA NRI 2009. The 2007 US Natural Resource Inventory (NRI). United States Department of Agriculture, Natural Resources Conservation Service. 2009. <http://www.nrcs.usda.gov/NRI>