

# Using Geographically Broad Commodity and Land-Use Modeling to Enhance Life Cycle Assessment of Greenhouse Emissions from US Biofuel Policy

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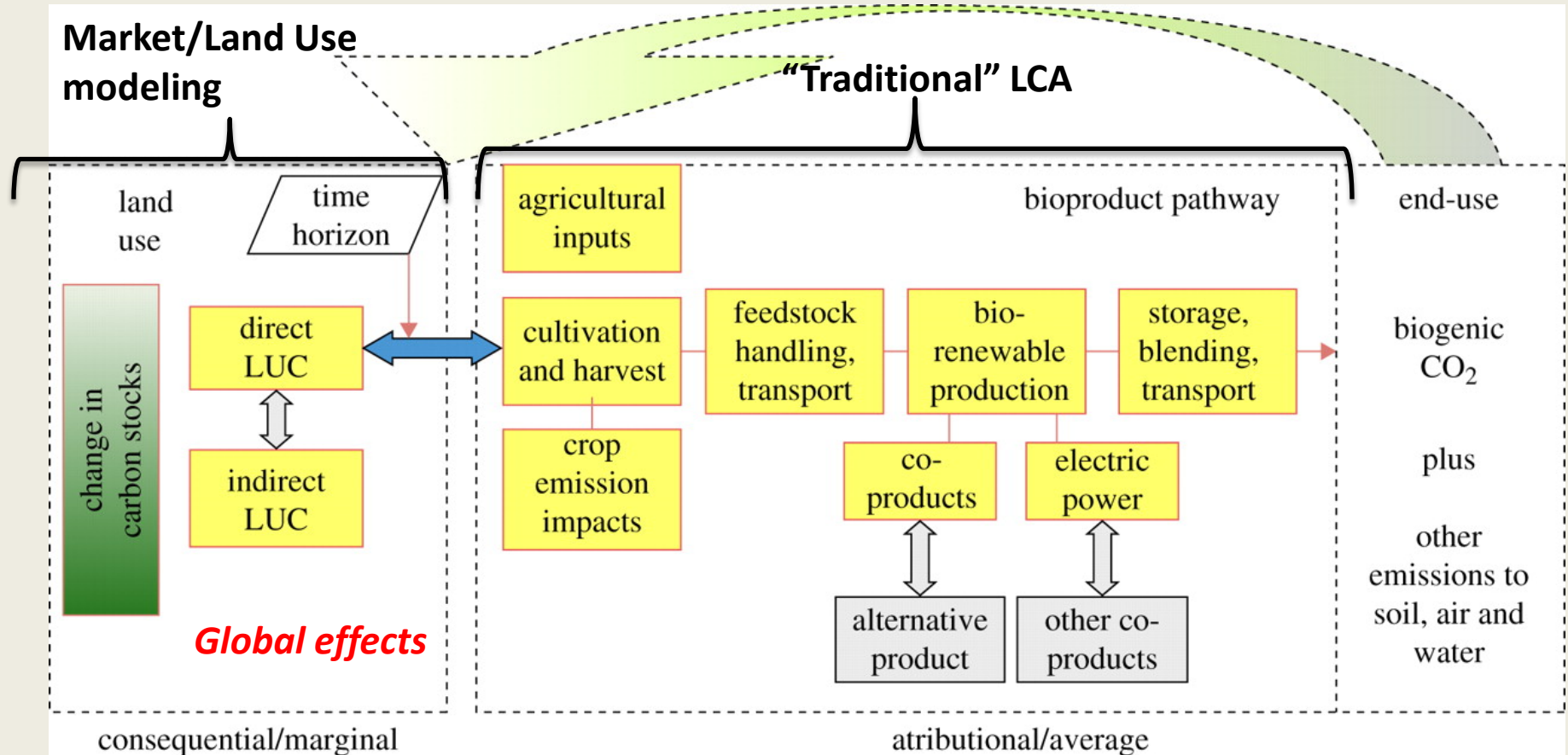
**CRC WORKSHOP ON LIFE CYCLE ANALYSIS OF TRANSPORTATION FUELS**

**Argonne National Laboratory**

**Argonne, IL**

**October 16, 2013**

# Biofuel lifecycle emissions

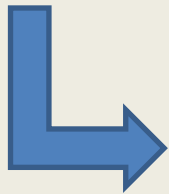


Hosseini and Shah. Multi-scale process and supply chain modelling: from lignocellulosic feedstock to process and products. *Interface Focus* 6 April 2011 vol. 1 no. 2 255-262

# Why does commodity market/land use linkage matter?

- In LCA, you want as complete a picture as possible
  - Hence the term “lifecycle”
  - But the integrated modeling is not so easy. Earlier assessments largely ignored it
- More recent studies have shown feedstock commodity-induced indirect land use change (ILUC) as an important issue
  - potential magnitudes large enough to change the sign (and presumed net benefit) of policies to expand biofuel

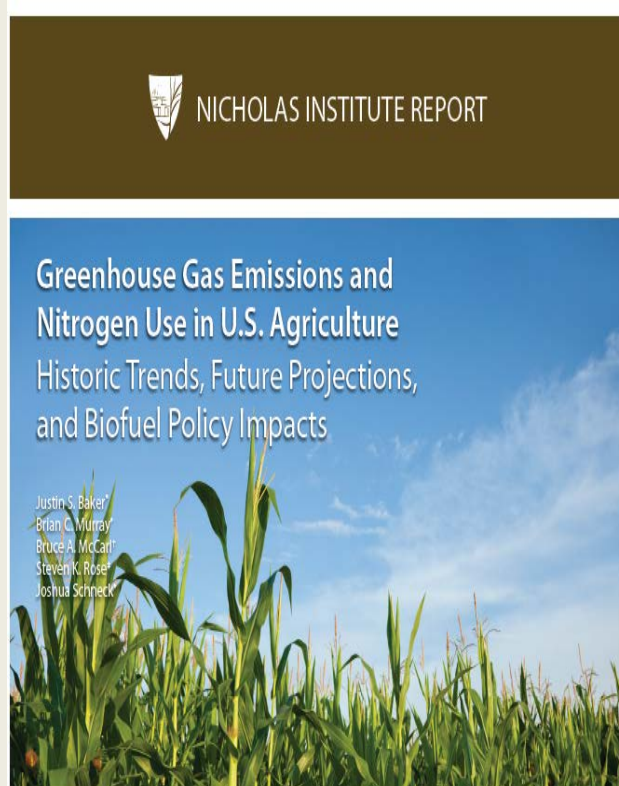
# ILUC potential grows as geographic scale grows



# Some recent studies of ILUC effects on biofuel net emissions

| Study                          | Outlet/date   | Policy   | Model                                  | Scope   | Net emissions effects  |
|--------------------------------|---|--|--|---|--|
| Searchinger et al              | <i>Science Express (2008)</i>                           | RFS Mandate  | Global land use model with GREET       | Global with indirect land use change (ILUC)               | “Payback periods for carbon debt”<br>+++ : corn<br>++ : cellulosic                                 |
| Fargione et al                 | <i>Science (2008)</i>                                   | NS: Increased ethanol (corn, cellulosic) and biodiesel production  | Calculation based on literature review | Select global locations                                   | ++++: palm biodiesel<br>+++ : corn ethanol<br>++ : sugarcane ethanol<br>0: prairie biomass ethanol |
| Hertel et al                   | <i>BioScience (2010)</i>                                | NS: Increased corn ethanol production                              | GTAP                                   | Global with ILUC  | +  |
| Tyner et al                    | <i>Argonne Working paper (2010)</i>                     | NS: Increased corn ethanol production                              | GTAP                                   | Global with ILUC  | -  |
| * Baker et al                  | <i>Nicholas Institute (Duke) Report (2011)</i>          | RFS Mandate  | FASOMGHG                               | Domestic US with ILUC                                     | -  |
| Thompson et al                 | <i>Energy Policy (2011)</i>                             | Tax subsidies, tariffs and mandates (corn, cellulosic and biofuel) | FAPRI                                  | Global with petroleum market feedbacks (and implied ILUC) | ++/-   |
| Zhang et al                    | <i>Env Research Letters (2010)</i>                      | LCFS (CA) – corn and cellulosic                                    | CA-GREET-GHG                           | Global with ILUC  | Corn: +/-<br>Cellulosic: ----  |
| * National Academy of Sciences | <i>NAS Report on GHG and the Tax Code (Ch. 5, 2013)</i> | Tax subsidies, tariffs and mandates (corn, cellulosic and biofuel) | FAPRI NEMS                             | Global with and without ILUC                              | +/-  |
| * Mosnier et al                | <i>Energy Policy (2013)</i>                             | RFS mandate – corn, cellulosic and biodiesel                       | GLOBIOM/FASOMGHG                       | Global with ILUC – non-CO2 gases                          | +/-  |

# Study 1: Net Domestic GHG Effects



**Policy: RFS2 variations (-25% to +25% of current standard)**

**Model: U.S. Forest and Agricultural Sector Optimization Model with GHGs (FASOMGHG)**

- Commodity markets (ag, forest, processing)
- Land Use change

**Scope of GHG coverage**

- United States
- Agricultural GHGs (CO<sub>2</sub>, CH<sub>4</sub>, N<sub>2</sub>O)
- Forest (CO<sub>2</sub>)
- Includes fuel use

**Outcomes of interest**

- GHG emissions
- N use

*(Baker et al, Nicholas Institute, 2011)*

# FASOMGHG Model Structure

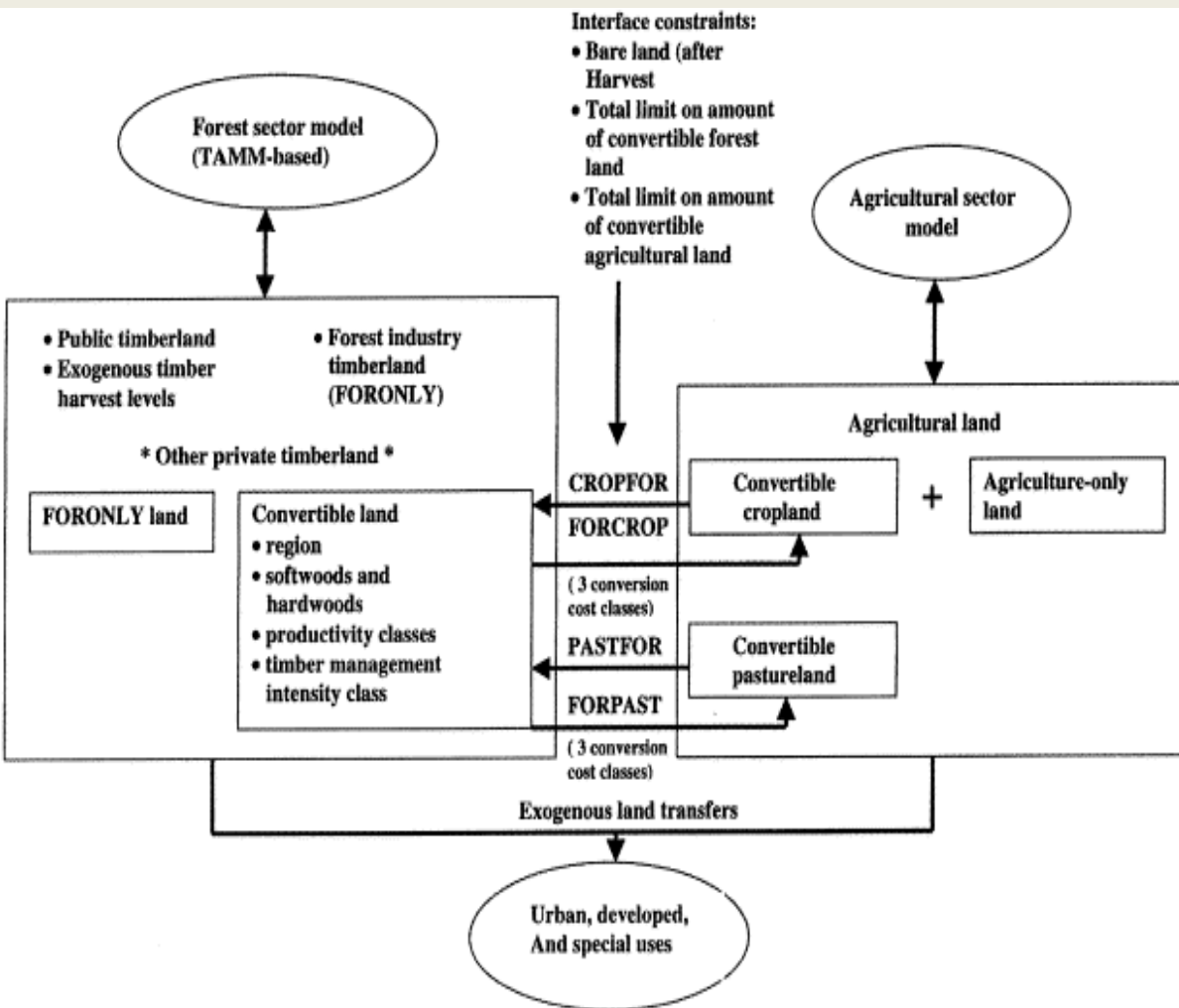


Figure 2-1. Map of the FASOMGHG Regions

# Policy Scenarios

**Table 12.** Biofuel production mandate constraints by scenario and time period

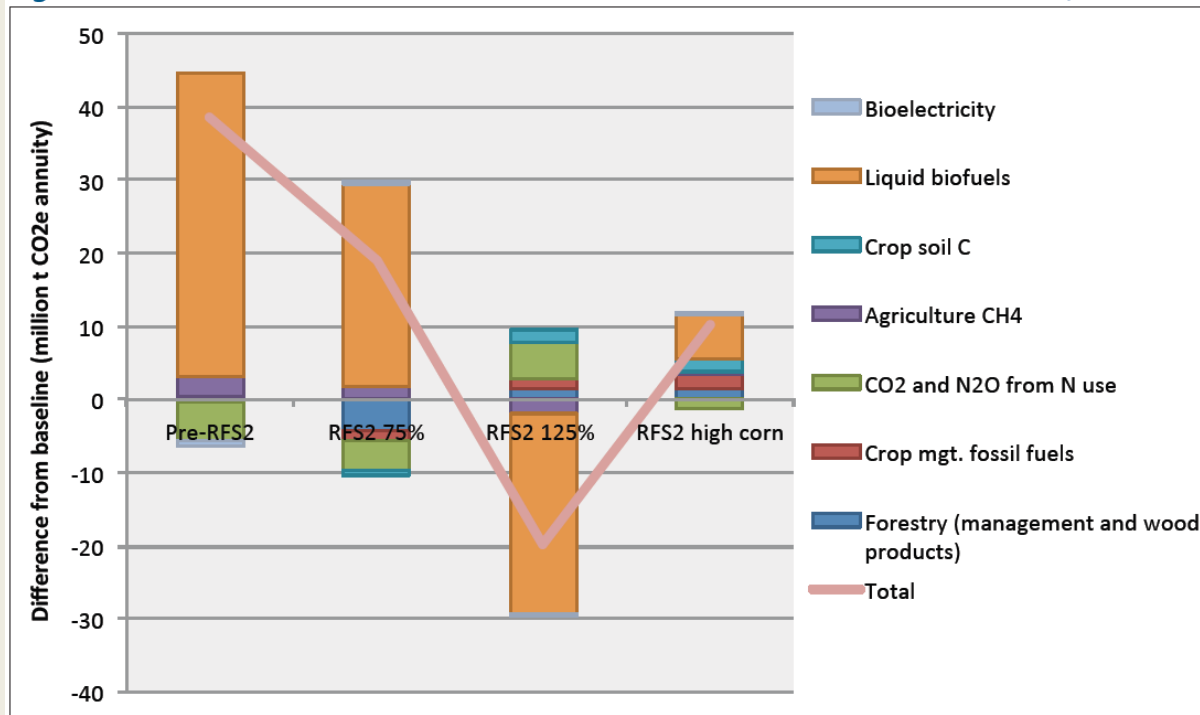
|                | Biofuel output<br>(billion gallons) | 2010  | 2015  | 2020  | 2025  | Constraint type |
|----------------|-------------------------------------|-------|-------|-------|-------|-----------------|
| RFS2 baseline  | Conventional ethanol                | 12.82 | 14.99 | 15.00 | 15.00 | Exact           |
|                | Cellulosic ethanol                  | 0.46  | 4.74  | 13.70 | 13.70 | Exact           |
|                | Biodiesel                           | 0.86  | 1.44  | 1.47  | 1.47  | Exact           |
| Pre-RFS2       | Conventional ethanol                | 10.80 | 11.31 | 12.30 | 13.12 | Exact           |
|                | Cellulosic ethanol                  | 0.00  | 0.25  | 0.25  | 0.25  | Lower-bound     |
|                | Biodiesel                           | 0.33  | 0.36  | 0.37  | 0.40  | Lower-bound     |
| RFS2 75%       | Conventional ethanol                | 9.61  | 11.24 | 11.25 | 11.26 | Exact           |
|                | Cellulosic ethanol                  | 0.34  | 3.56  | 10.28 | 10.26 | Exact           |
|                | Biodiesel                           | 0.65  | 1.08  | 1.10  | 1.37  | Exact           |
| RFS2 125%      | Conventional ethanol                | 16.02 | 18.73 | 18.75 | 18.75 | Exact           |
|                | Cellulosic ethanol                  | 0.57  | 5.93  | 17.13 | 17.13 | Exact           |
|                | Biodiesel                           | 1.08  | 1.81  | 1.84  | 1.84  | Exact           |
| RFS2 high corn | Conventional ethanol                | 7.21  | 14.77 | 21.55 | 21.55 | Exact           |
|                | Cellulosic ethanol                  | 0.26  | 4.74  | 7.17  | 7.17  | Exact           |
|                | Biodiesel                           | 0.48  | 1.44  | 1.47  | 1.47  | Exact           |

Note: "Exact" indicates a hard constraint.



# Core GHG emissions result: RFS2 does reduce net emissions

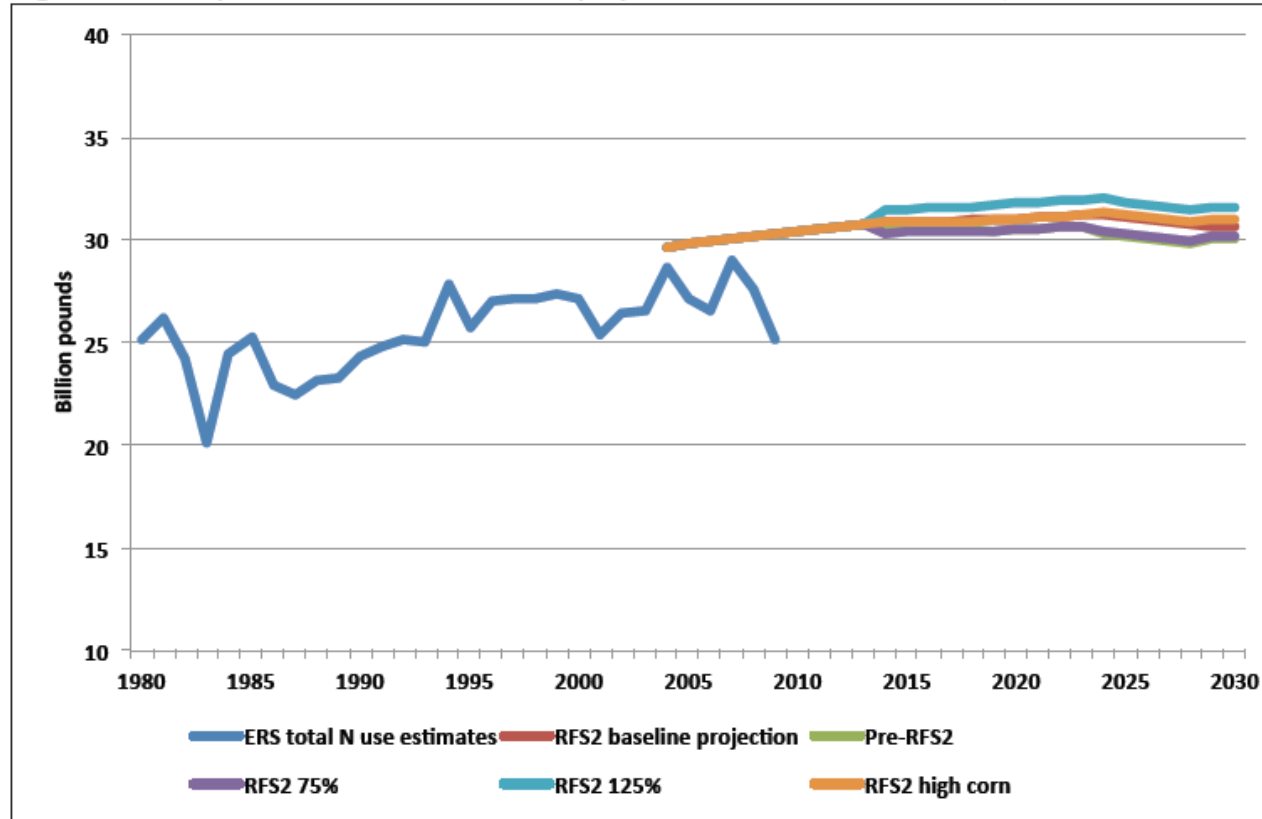
Figure 28. Annualized difference in emissions from baseline across biofuel scenarios (million t CO<sub>2</sub>e)



**Key factor – Geographic scope is US only. What if we looked globally and took in more Induced land use change?**

# N Use Projections

Figure 23. Comparison of historic N use to projected N use over time and by biofuel scenario

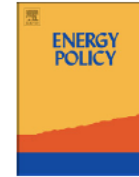




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## Alternative U.S. biofuel mandates and global GHG emissions: The role of land use change, crop management and yield growth

A. Mosnier<sup>a,b,\*</sup>, P. Havlík<sup>a,c</sup>, H. Valin<sup>a</sup>, J. Baker<sup>d</sup>, B. Murray<sup>e</sup>, S. Feng<sup>f</sup>, M. Obersteiner<sup>a</sup>, B.A. McCarl<sup>f</sup>, S.K. Rose<sup>g</sup>, U.A. Schneider<sup>h</sup>

<sup>a</sup> *Scenarios, Simulations and Management Systems, International Institute of Applied Systems Analysis, Laxenburg, Austria*

**Mosnier et al, 2013**

**Policy:** RFS2 variations (-50% to +50% of current standard, High Corn RFS2)

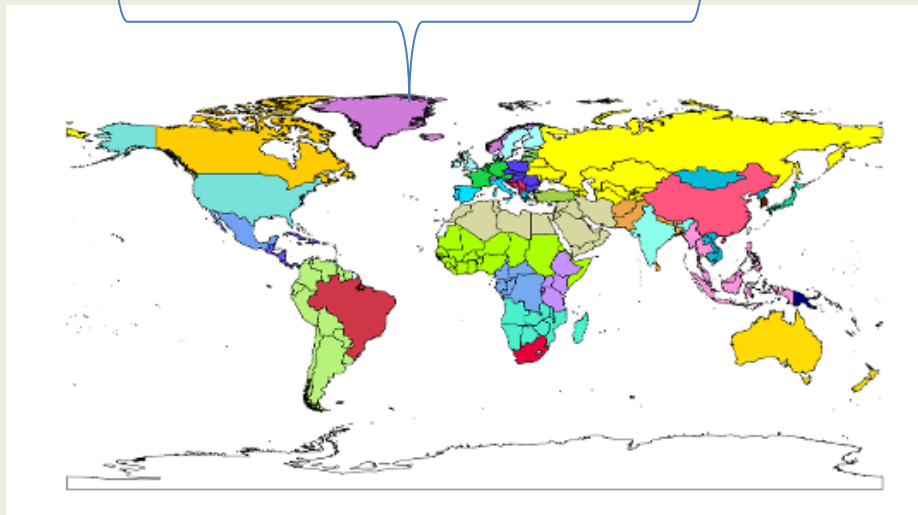
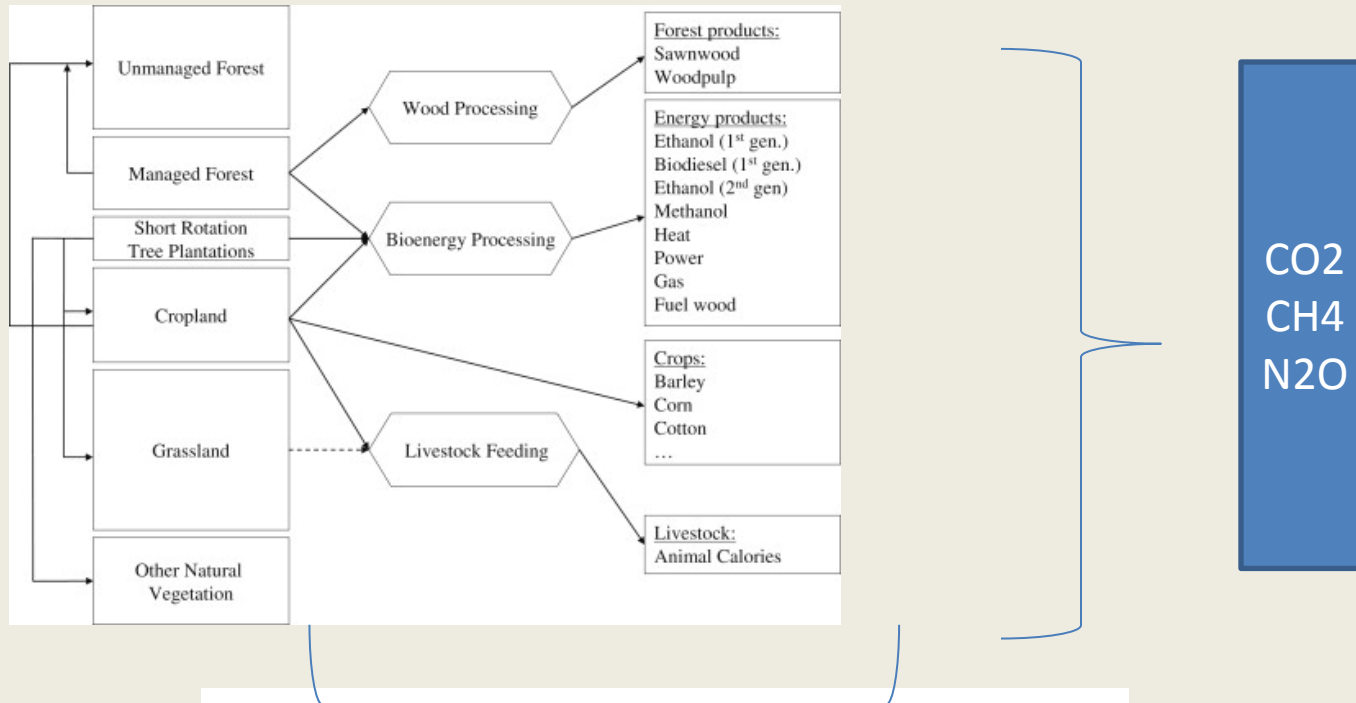
**Model:** Global Biosphere Management Model (GLOBIOM)  
with linkage to FASOMGHG

- Commodity markets and land use change

### Scope of GHG coverage

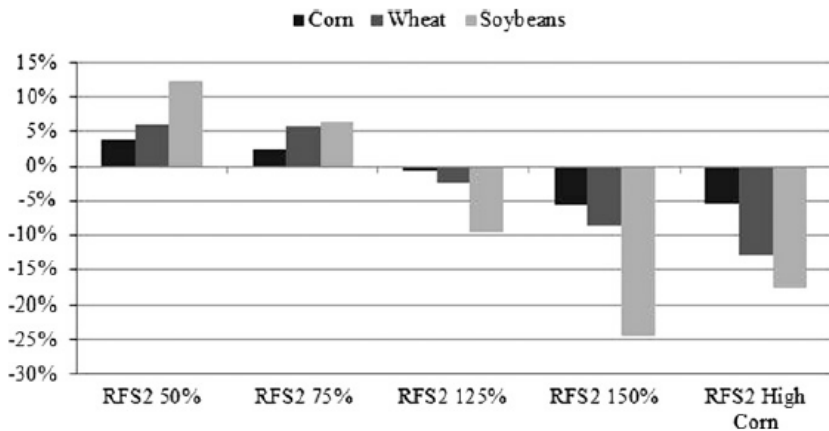
- Global
- Agricultural GHGs (CO<sub>2</sub>, CH<sub>4</sub>, N<sub>2</sub>O)
- Forest (CO<sub>2</sub>)
- Includes fuel use

# GLOBIOM: Sectoral and Global Integration

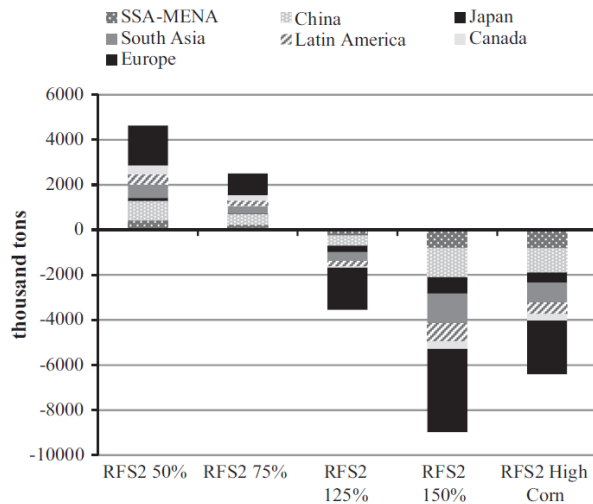


**Global markets and  
Resource allocation  
(emissions too)**

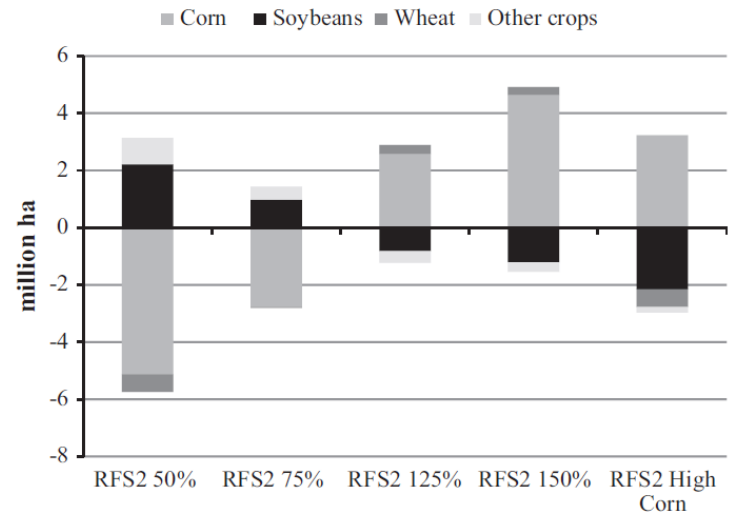
# Commodity Trade/Land Use Effects



**Fig. 1.** U.S. net exports in five biofuel policy scenarios relative to the RFS2 baseline in 2020.



**Fig. A2.** Absolute differences in soybean U.S. exports by destination relative to the RFS2 baseline in 2020.



**Fig. A3.** Absolute area change by crop relative to the RFS2 baseline in 2020 in the United States.

Table 2

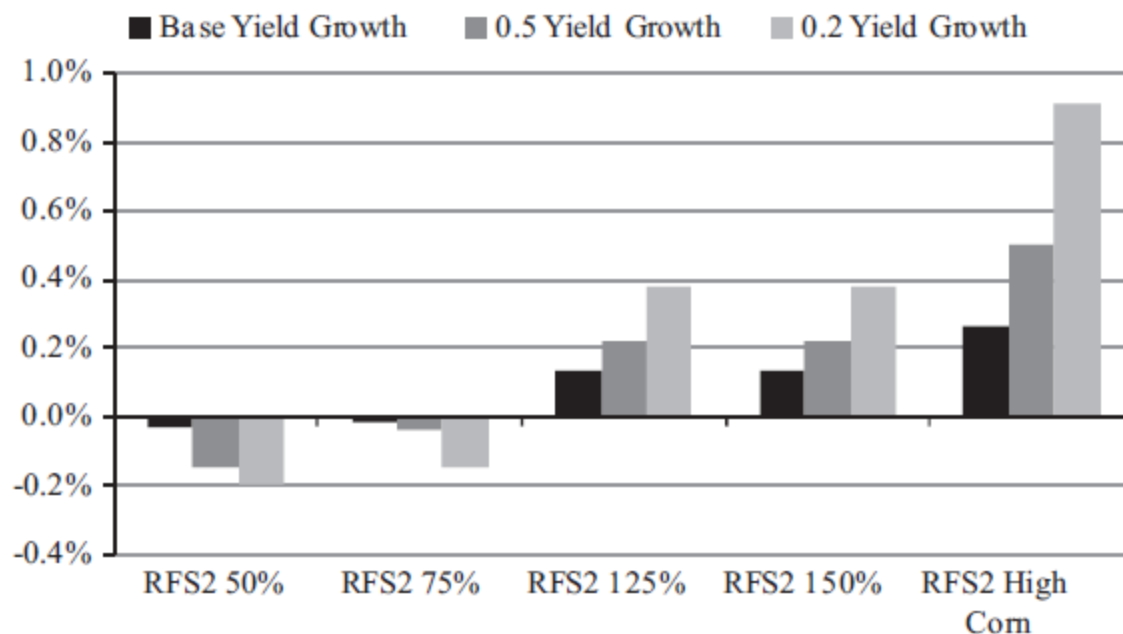
Annualized GHG emissions by source for different U.S. biofuel targets (in million ton CO<sub>2</sub> equivalent).**Baseline**

| Source of GHG emissions         | RFS2 50%    | RFS2 75%    | RFS2 100%   | RFS2 125%   | RFS2 150%   | RFS2 High Corn |
|---------------------------------|-------------|-------------|-------------|-------------|-------------|----------------|
| <b>U.S.</b>                     |             |             |             |             |             |                |
| Afforestation                   | -23         | -23         | -23         | -24         | -24         | -23            |
| Deforestation                   | 33          | 34          | 34          | 33          | 34          | 33             |
| Other LUC                       | 3           | 4           | 5           | 5           | 7           | 6              |
| <b>Total LUC</b>                | <b>14</b>   | <b>14</b>   | <b>16</b>   | <b>15</b>   | <b>17</b>   | <b>16</b>      |
| Crop                            | 302         | 315         | 328         | 345         | 358         | 338            |
| Livestock                       | 225         | 225         | 226         | 226         | 226         | 226            |
| <b>Total agriculture</b>        | <b>527</b>  | <b>540</b>  | <b>554</b>  | <b>571</b>  | <b>584</b>  | <b>564</b>     |
| <b>Fossil fuel displacement</b> | <b>-59</b>  | <b>-88</b>  | <b>-120</b> | <b>-153</b> | <b>-185</b> | <b>-119</b>    |
| <b>Total</b>                    | <b>482</b>  | <b>467</b>  | <b>450</b>  | <b>434</b>  | <b>416</b>  | <b>461</b>     |
| <b>Rest of the world</b>        |             |             |             |             |             |                |
| Afforestation                   | -21         | -21         | -20         | -19         | -20         | -20            |
| Deforestation                   | 920         | 931         | 935         | 943         | 957         | 942            |
| Other LUC                       | 223         | 225         | 230         | 236         | 243         | 233            |
| <b>Total LUC</b>                | <b>1122</b> | <b>1135</b> | <b>1145</b> | <b>1160</b> | <b>1180</b> | <b>1156</b>    |
| Crop                            | 3477        | 3484        | 3496        | 3510        | 3520        | 3501           |
| Livestock                       | 2697        | 2698        | 2694        | 2695        | 2694        | 2695           |
| <b>Total Agriculture</b>        | <b>6174</b> | <b>6182</b> | <b>6190</b> | <b>6205</b> | <b>6214</b> | <b>6196</b>    |
| <b>Fossil Fuel Displacement</b> | <b>-162</b> | <b>-165</b> | <b>-167</b> | <b>-169</b> | <b>-171</b> | <b>-167</b>    |
| <b>Total</b>                    | <b>7134</b> | <b>7151</b> | <b>7169</b> | <b>7196</b> | <b>7223</b> | <b>7185</b>    |
| <b>World</b>                    |             |             |             |             |             |                |
| Afforestation                   | -44         | -44         | -44         | -42         | -43         | -44            |
| Deforestation                   | 953         | 964         | 969         | 976         | 991         | 976            |
| Other LUC                       | 226         | 229         | 235         | 242         | 250         | 239            |
| <b>Total LUC</b>                | <b>1136</b> | <b>1149</b> | <b>1161</b> | <b>1176</b> | <b>1197</b> | <b>1172</b>    |
| Crop                            | 3780        | 3799        | 3824        | 3855        | 3879        | 3840           |
| Livestock                       | 2923        | 2923        | 2920        | 2921        | 2920        | 2921           |
| <b>Total agriculture</b>        | <b>6703</b> | <b>6722</b> | <b>6744</b> | <b>6776</b> | <b>6799</b> | <b>6761</b>    |
| <b>Fossil fuel displacement</b> | <b>-221</b> | <b>-253</b> | <b>-286</b> | <b>-322</b> | <b>-356</b> | <b>-286</b>    |
| <b>Total</b>                    | <b>7617</b> | <b>7618</b> | <b>7619</b> | <b>7629</b> | <b>7639</b> | <b>7646</b>    |

US: Raising RFS2 lowers emissions  
 Greater reliance on corn raises emissions

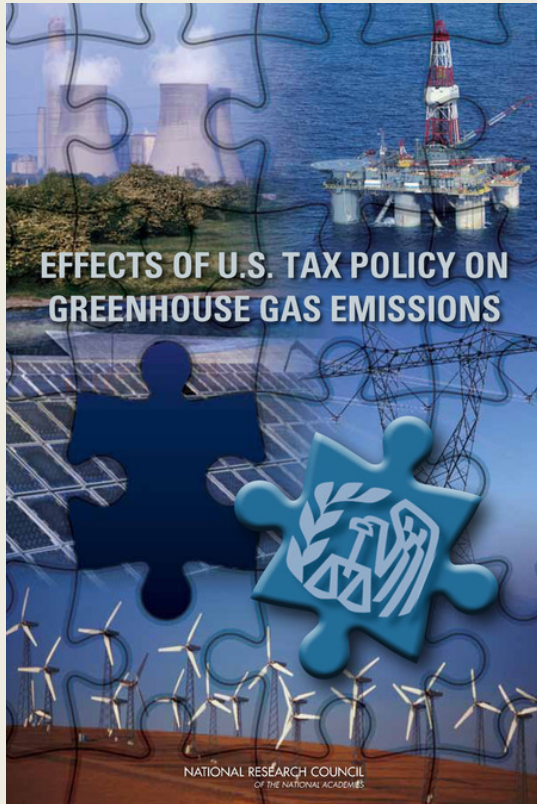
Globally: Raising RFS2 raises emissions  
 as does reliance on corn

# Sensitivity to Projected Yield Assumptions



**Fig. 2.** Sensitivity of global annualized GHG emissions to varying assumptions about exogenous productivity growth relative to RFS2 baseline. *Note:* GHG emissions are computed as an average annuity over the 2010–2030 period with a 4% discount rate.

***ILUC emissions effects are far more pronounced under more pessimistic yield assumptions***



*(NAS, 2013)*

## **Policy: US Biofuel Tax Subsidies with and without RFS)**

### **Models: FAPRI and NEMS**

- Ag Commodity markets
- Biofuel markets
- Petroleum markets

### **Scope of GHG coverage**

- Global (FAPRI) United States (NEMS)
- Agricultural GHGs (Co<sub>2</sub>, CH<sub>4</sub>, N<sub>2</sub>O)
- Fuel use
- ILUC (by varying assumptions)

### **Outcomes of interest**

- GHG emissions
- US Treasury revenues



**TABLE 5-2 Removal of Biofuel Provisions – Key Modeling Results**

| Key Variable (annual average, 2014-2021)                   | Remove VEETC                          |                                       |        | Remove all Provisions                 |         |
|--|---------------------------------------|---------------------------------------|--------|---------------------------------------|---------|
|  | Change Relative to Reference Scenario |                                       |        | Change Relative to Reference Scenario |         |
| CO <sub>2</sub> -e Emissions (MMT)                         | -4.8                                  |                                       |        | -5.4                                  |         |
| Federal Expenditures (\$ billion)                          | -7.2                                  |                                       |        | -12.6                                 |         |
| Tons CO <sub>2</sub> -e per \$ of Revenue (calculated)     | 0.0007                                |                                       |        | 0.0004                                |         |
|  | Baseline (with RFS2)                  | Change Relative to Reference Scenario | %      | Change Relative to Reference Scenario | %       |
| <i>FUEL USE<br/>(billion gallons, gasoline equivalent)</i> |                                       |                                       |        |                                       |         |
| Gasoline Use   |                                       |                                       |        |                                       |         |
| World  | 360.10                                | +0.44                                 | +0.1%  | +0.64                                 | +0.2%   |
| U.S.   | 120.91                                | +1.29                                 | +1.1%  | +1.30                                 | +1.1%   |
| Ethanol Use  |                                       |                                       |        |                                       |         |
| World  | 27.75                                 | -1.15                                 | -4.1%  | -2.35                                 | -8.5%   |
| U.S.   | 15.27                                 | -1.60                                 | -10.5% | -1.72                                 | -11.3%  |
| Conventional   | 11.90                                 | -1.74                                 | -14.6% | -1.75                                 | -14.7%  |
| Cellulosic   | 2.33                                  | 0.69                                  | +29.5% | -1.58                                 | -67.9%  |
| Other Advanced   | 1.04                                  | -0.55                                 | -52.7% | +1.61                                 | +154.4% |
| Diesel Use   |                                       |                                       |        |                                       |         |
| World  | 445.14                                | +0.25                                 | +0.1%  | +0.42                                 | +0.1%   |
| U.S.   | 73.20                                 | -0.08                                 | -0.1%  | -0.11                                 | -0.2%   |
| Biodiesel Use  |                                       |                                       |        |                                       |         |

|   |        |       |        |       |        |
|---|--------|-------|--------|-------|--------|
| World   | 9.43   | 0.00  | —      | -0.01 | -0.1%  |
| U.S.  | 1.31   | 0.00  | —      | 0.00  | —      |
| U.S. FUEL PRICES<br>(wholesale \$ per gallon unless<br>otherwise indicated) |        |       |        |       |        |
| Petroleum Refiner's Cost (\$/barrel)  | 123.47 | +0.63 | +0.5%  | +0.91 | +0.7%  |
| Gasoline  | 3.52   | +0.06 | +1.7%  | +0.07 | +2.0%  |
| Ethanol   |        |       |        |       |        |
| Conventional  | 2.82   | -0.30 | -10.5% | -0.26 | -9.1%  |
| Cellulosic  | 4.12   | +0.21 | +5.0%  | -0.63 | -15.3% |
| Other Advanced  | 3.27   | -0.24 | -7.4%  | -0.07 | -2.2%  |
| Diesel  | 2.90   | +0.02 | +0.7%  | +0.03 | +1.0%  |
| Biodiesel   | 5.51   | -0.09 | -1.6%  | -0.11 | -2.0%  |
| CROP AREA (MM ac)   |        |       |        |       |        |
| World   |        |       |        |       |        |
| Corn  | 439.9  | -4.27 | -1.0%  | -3.26 | -0.7%  |
| Soybean   | 278.9  | +1.27 | +0.5%  | +1.09 | +0.4%  |
| U.S.  |        |       |        |       |        |
| Corn  | 93.8   | -3.32 | -3.5%  | -2.47 | -2.6%  |
| Soybean   | 73.4   | +1.15 | +1.6%  | +1.05 | +1.4%  |
| U.S. CROP PRICES (\$/bushel)  |        |       |        |       |        |
| Corn  | 5.42   | -0.34 | -6.3%  | -0.30 | -5.5%  |
| Soybeans  | 11.98  | -0.23 | -2.0%  | -0.27 | -2.2%  |

# Sensitivity to inclusion of RFS2 and to scope of ILUC coverage

**TABLE 5-5** Sensitivity of GHG Impacts from Variations in Biofuel GHG Emission Coefficients: *Removing all Provisions* Scenario (All quantities are changes from baseline, million t CO<sub>2</sub>-e, 2014-2021 annual average.)

|           | EISA | EPA w/ILUC | EPA w/o ILUC | High Biofuel Emissions | Low Biofuel Emissions |
|-----------|------|------------|--------------|------------------------|-----------------------|
| With RFS2 | -5.4 | -2.2       | +3.5         | -14.9                  | +6.7                  |
| No RFS2   | -7.0 | -5.6       | +2.4         | -14.1                  | +3.7                  |

- *RFS2 mandate limits response to removing the subsidy*
- *Inclusion of ILUC can change the sign of the net emissions effect*

# Take Home Messages

- **ILUC from biofuel policy is too important to ignore**
  - Best way to address it is through explicit connection of biofuel policy/demand – commodity markets – and land use - GHGs Broad geography gives more complete estimate, but perhaps greater room for specification error
- **Modeling estimates suggest...**

If not a consensus, certain patterns are emerging ...

  - Biofuel policy – even with high dependence on corn ethanol, can be net GHG reducer if looking just within US
  - If we look globally, the net effects tend toward net GHG neutrality/ increases from increased biofuel use, but effects are small
  - Global net emissions effects tend to be small - less than 20% of one US coal plant (NAS study)
- ***Ex post* empirical analysis should emerge to help “true up” perspectives set by *ex ante* modeling**
- **Policy implications**
  - RFS and tax subsidies are duplicative and with one in place, the other is marginally less effective
  - Aggressive biofuels policy should probably be matched with aggressive policies to raise/maintain agricultural productivity – globally
  - Need more advances in cellulosic technology
  - Underscores that biofuel policy best viewed through multiple lens – GHG, energy security, local economic development

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  - Peter Havlik, IIASA
  - Michael Obersteiner, IIASA
  - Hugo Valin, IIASA
  - Siyi Feng, Texas A&M
  - Uwe Schneider, U Hamburg
  - William Nordhaus, Yale U
  - John Reilly, MIT
  - Maureen Cropper, U Maryland/RFF
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