



## **Partnership for AiR Transportation Noise and Emission Reduction**

*Center of Excellence*

FAA • NASA • Transport Canada • DOD • EPA

---

# **Issues Related to Uncertainty and Variability in LCA Modeling**

**Jim Hileman, Russ Stratton, and Hsin Min Wong**

**Massachusetts Institute of Technology**

**CRC Workshop on Life Cycle Analysis of Biofuels**

**Argonne National Laboratory**

**October 18, 2011**

This work is funded by the FAA and the U.S. Air Force Research Lab, under FAA Award No.:  
06-C-NE-MIT, Amendment Nos. 012, 021, 023, and 027 09-C-NE-MIT, Amendment Nos. 002 and 004.  
Managers: Warren Gillette (FAA), Bill Harrison and Tim Edwards (AFRL)

Any opinions, findings, and conclusions or recommendations expressed in this material are those of the author(s)  
and do not necessarily reflect the views of the FAA, NASA, AFRL, or Transport Canada



## Motivation

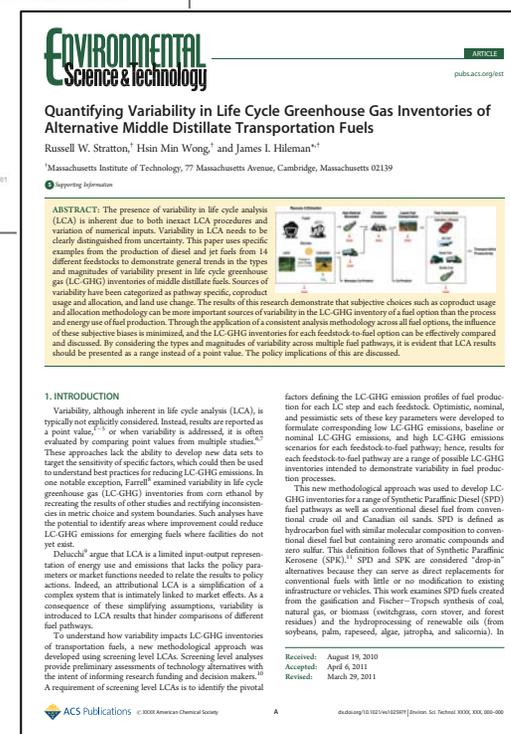
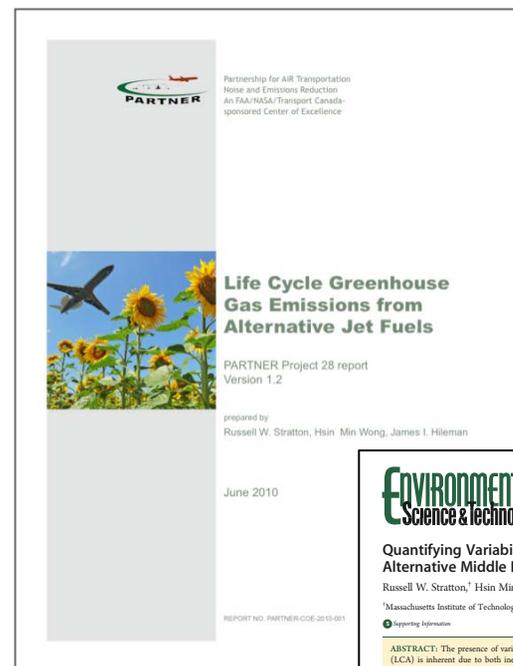
- Variability, although inherent in LCA, is often not explicitly considered
- Results are typically reported as a point value
  - These approaches cannot develop new data sets to target the sensitivity of specific factors, which could help understand best practices for reducing LC-GHG emissions
- A new methodological approach was developed using screening level LCAs to understand how variability impacts LC-GHG inventories of transportation fuels
- Screening level analyses provide preliminary assessments of technology alternatives with the intent of informing research funding and decision makers
  - Identify pivotal factors defining the LC-GHG emission profiles of fuel production for each LC step and each feedstock

# Drop-In Fuel Life Cycle GHG Emissions

PARTNER Project 28 Report and ES&T Article

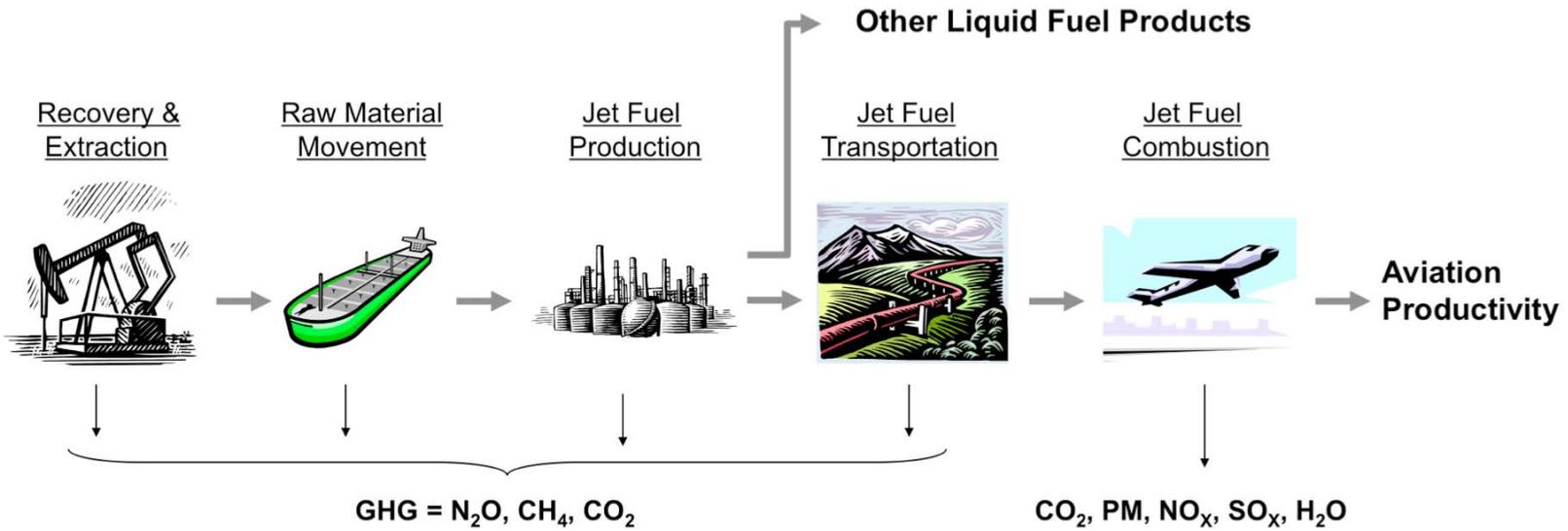


- PARTNER Jet Fuel Study
  - Screening level study of next generation alternative jet fuels
  - Examine low, baseline, and high emissions scenarios
  - Emphasize influential aspects of fuel production on GHG emissions
- Results are a range of possible LC-GHG inventories intended to demonstrate variability in fuel production processes.
- Other issues considered: land, water, invasiveness
- Developed analysis into a diesel fuel article for ES&T



# Well-to-Wake GHG Emissions

## Fossil-based Jet Fuels



### Key Issues in Life Cycle Analysis:

- System Boundary Definition
- Allocating Emissions among Co-Products
- Data Quality and Uncertainty

Analysis based on GREET 1.8 – some of these results have subsequently been incorporated into GREET.1.2011\*

\* GREET Website: [http://www.transportation.anl.gov/modeling\\_simulation/GREET/](http://www.transportation.anl.gov/modeling_simulation/GREET/)

# Fuel Pathways Examined for LC GHG

All result in a product slate of diesel, jet, and naphtha



<u>Source</u>	<u>Feedstock</u>	<u>Recovery</u>	<u>Processing</u>	<u>Final Product</u>
<b>Petroleum</b>	Conventional crude	Crude extraction	Crude refining	Jet A / Diesel
	Conventional crude	Crude extraction	Crude refining	ULSJ/D
	Canadian oil sands	Bitumen mining/ extraction and upgrading	Syncrude refining	Jet A / Diesel
	Oil shale	In-situ conversion	Shale oil refining	Jet A / Diesel
<b>Natural gas</b>	Natural gas	Natural gas extraction and processing	Gasification, F-T reaction and upgrading (with and without carbon capture)	SPK Jet / Diesel Fuel (F-T)
<b>Coal</b>	Coal	Coal mining	Gasification, F-T reaction and upgrading (with and without carbon capture)	SPK Jet / Diesel Fuel (F-T)
<b>Coal and Biomass</b>	Coal and Biomass	Coal mining and biomass cultivation	Gasification, F-T reaction and upgrading (with and without carbon capture)	SPK Jet / Diesel Fuel (F-T)
<b>Biomass</b>	Biomass – switchgrass – corn stover – forest waste	Biomass cultivation	Gasification, F-T reaction and upgrading	SPK Jet / Diesel Fuel (F-T)
	Renewable oil – soybeans – palm – algae – jatropha – rapeseed – salicornia	Biomass cultivation and extraction of plant oils	Hydroprocessing	SPK Jet / Diesel Fuel (HRJ/HRD)

# Variability in LC GHG Inventories

- LCA is a technique to simplify a complex system that is intimately linked to market effects. Result is a system of input-output representations of energy use and emissions.
- Necessity for simplifying assumptions introduces variability into LCA results that hinder comparisons of different fuel pathways.

## Types of variability:

Pathway Specific • Co-product Usage and Allocation • Land Use Change

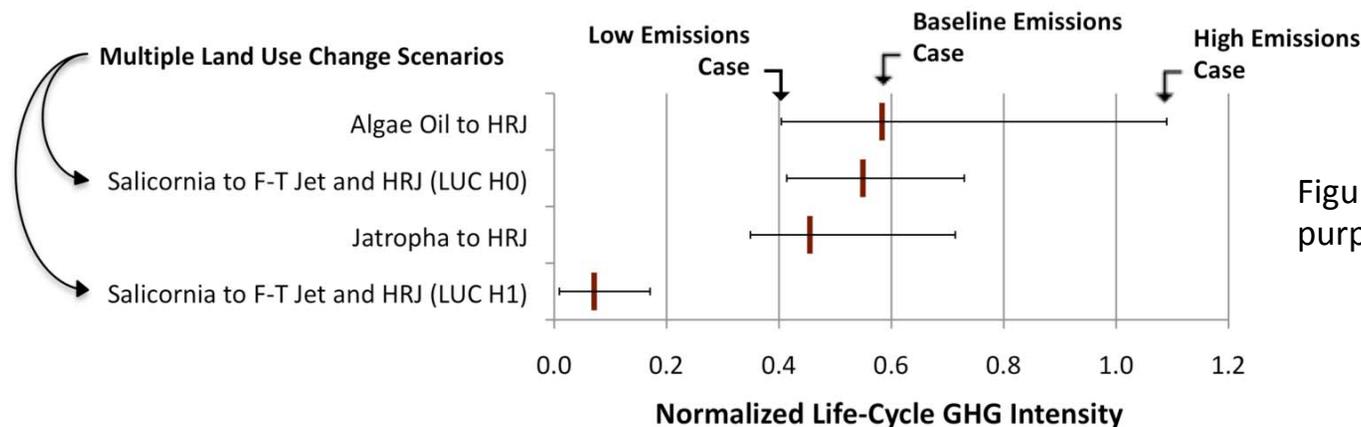
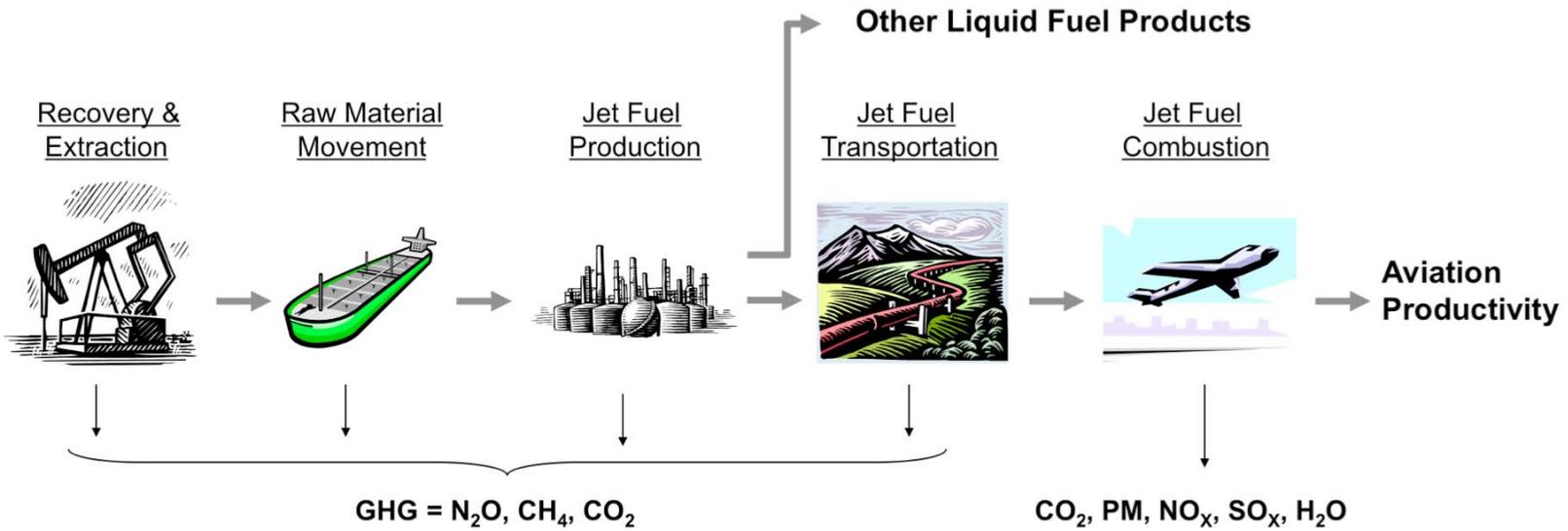


Figure for illustrative purposes only

**Variability considered using scenarios with consistent assumption sets**

# Pathway Specific Variability



Screening level analyses include all key processes, but only parameters with considerable influence on results examined in detail.

Such key parameters can be examined to ascertain pathway-specific variability that is present in all fuel options.

Two examples:

- Petroleum extraction for conventional fuel production
- Fischer-Tropsch diesel fuel production from a combination of coal and biomass

# Pathway Specific Variability

## Conventional Jet Fuel

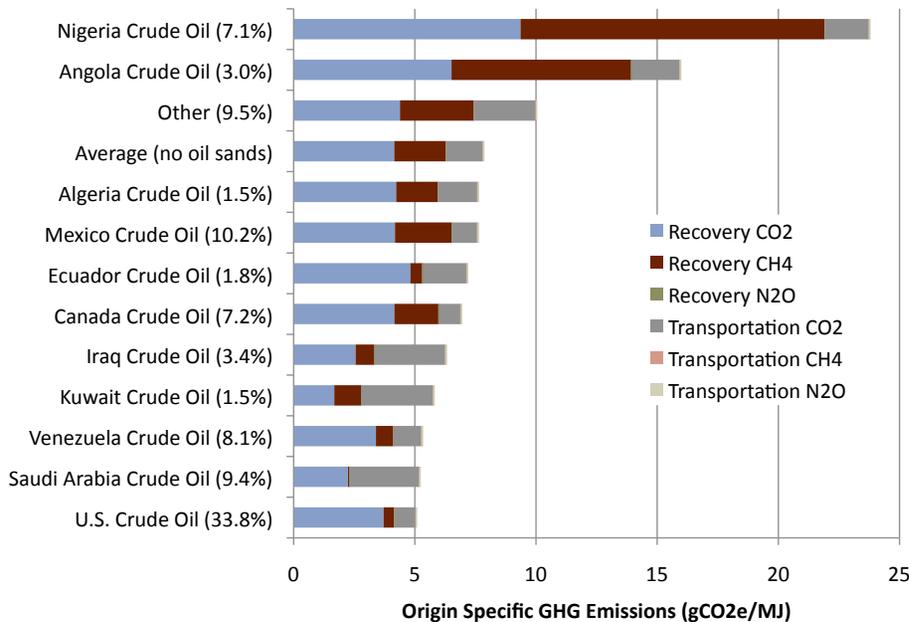
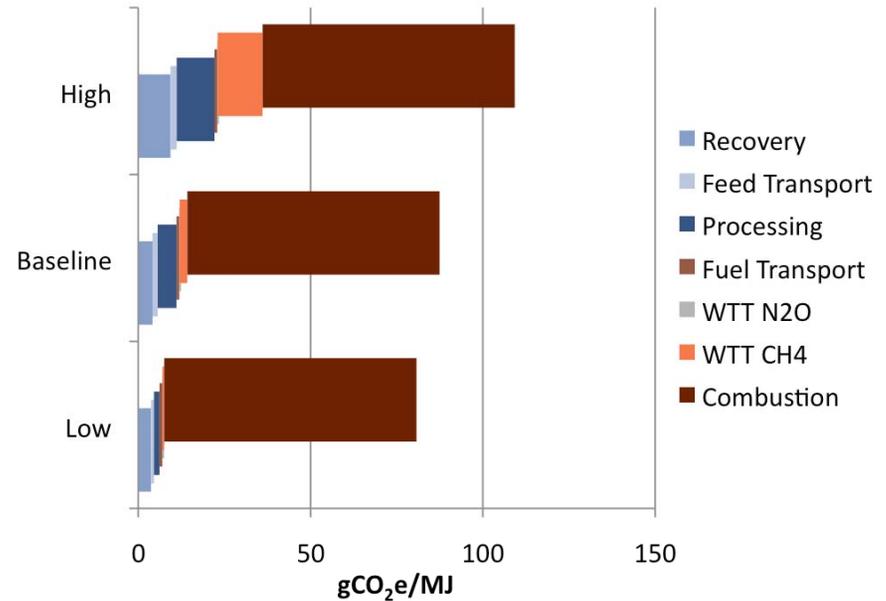


- Life cycle analysis is fundamentally a comparative tool
- Fuel from conventional crude is benchmark for alternative fuels

Total =  
109.3 gCO<sub>2</sub>e/MJ

Total =  
87.5 gCO<sub>2</sub>e/MJ

Total =  
80.7 gCO<sub>2</sub>e/MJ



***Consistency between analysis methodologies is essential for comparisons and for setting a baseline***

# Pathway Specific Variability

## F-T Fuel from Coal and Switchgrass w/ CCS

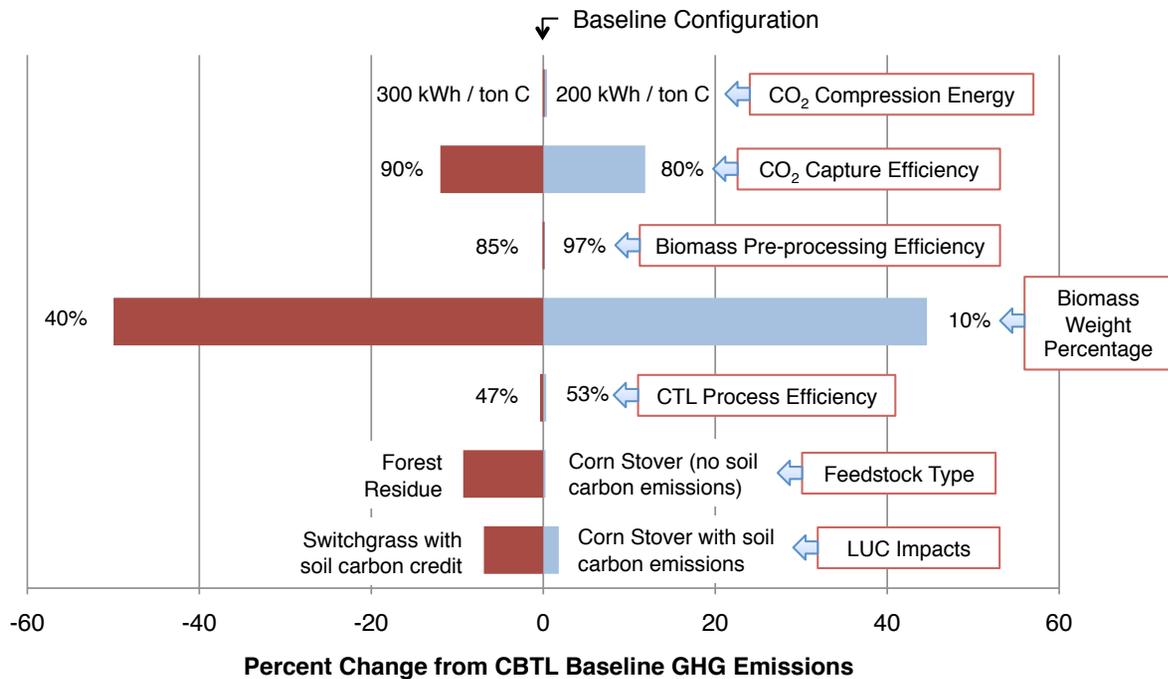
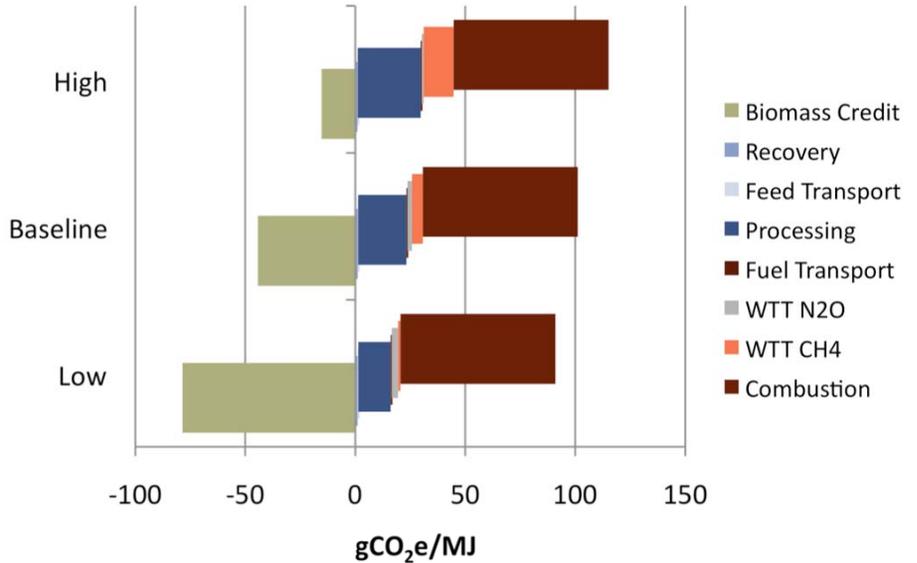


Majority of disparity between cases comes from biomass weight percent and CCS efficiency

Total = 99.8 gCO<sub>2</sub>e/MJ

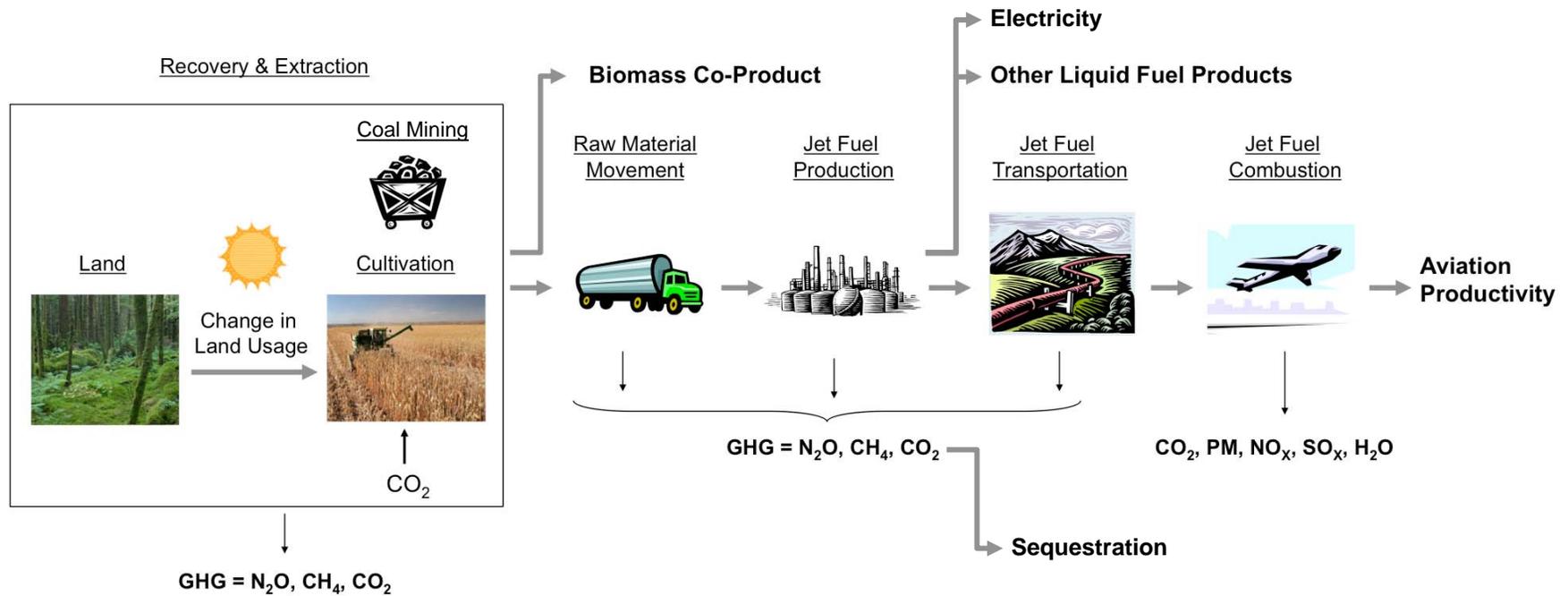
Total = 56.9 gCO<sub>2</sub>e/MJ

Total = 12.4 gCO<sub>2</sub>e/MJ



- Feedstock type, biomass weight percent and CCS efficiency → **Very Important for GHG**
- Process Efficiency and energy inputs → **Less important for GHG**

# Allocating GHG among Co-Products



## Examples:

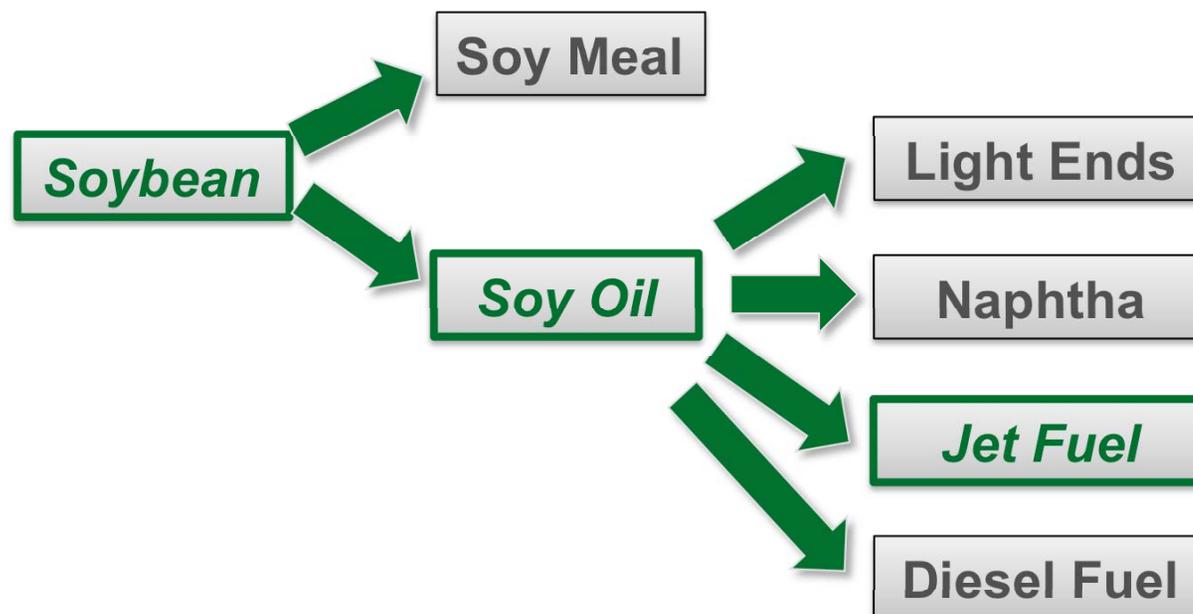
- Soybean and jatropha to hydroprocessed fuels (HRx)
- Fischer-Tropsch fuel production

# Co-product Usage and Allocation

## Soybean to HRx



- For well established pathways, need an allocation methodology that **reflects the established co-product usage**
- Example: Soybean to Hydroprocessed Renewable Diesel/Jet/Naptha (HRx) Fuel

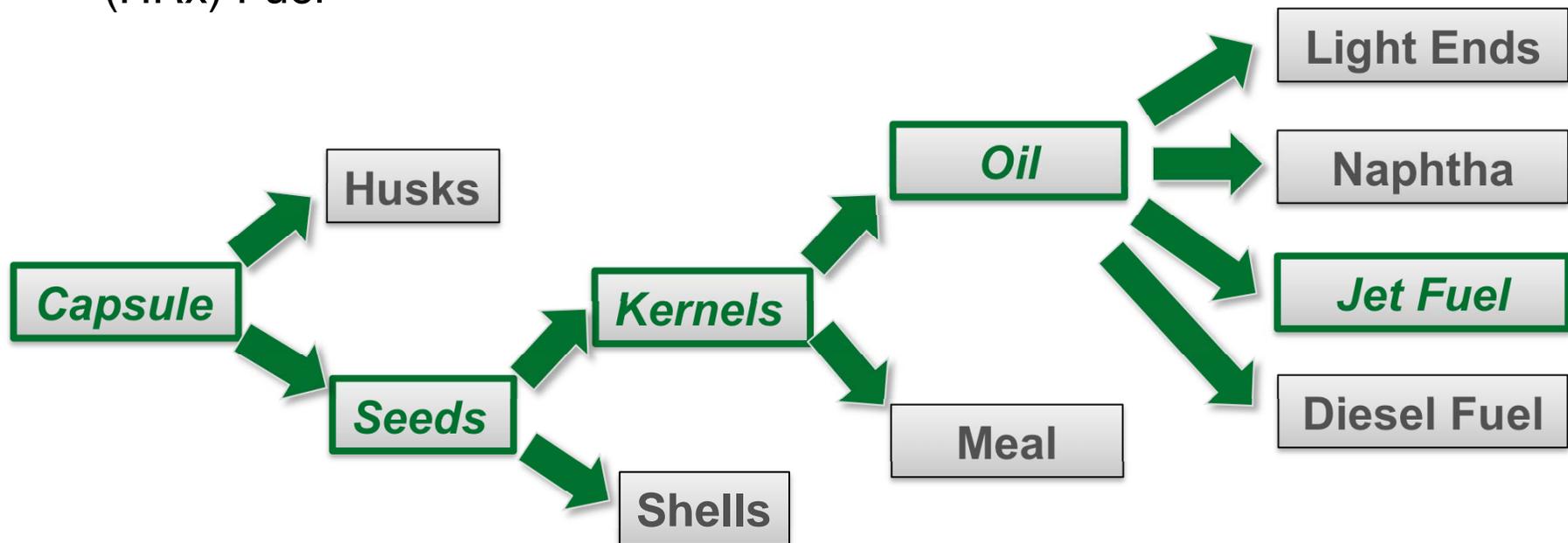


# Co-product Usage and Allocation

## Jatropha to HRx (1)



- For emerging pathways, need to **examine the range of possible co-product uses** and allocation methodology
- Example: Jatropha to Hydroprocessed Renewable Diesel/Jet/Naptha (HRx) Fuel



**Trade studies were conducted to examine the impacts of different co-product usage assumptions and allocation methodologies**

# Co-product Usage and Allocation

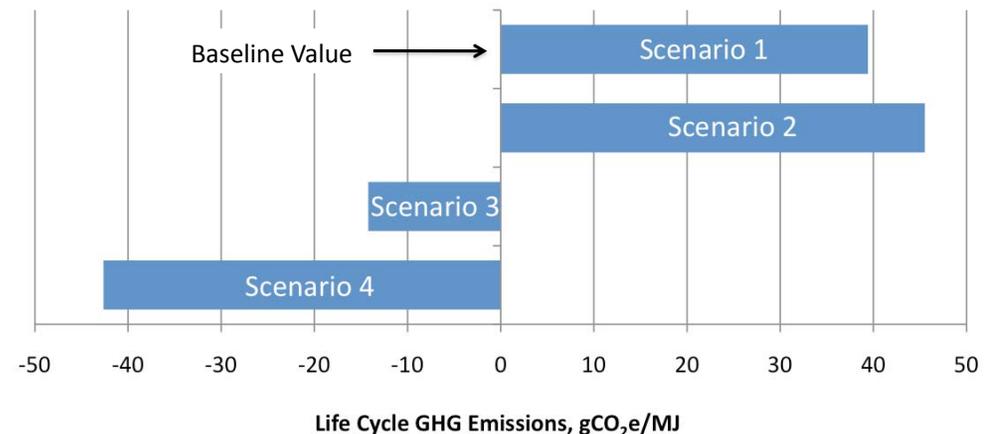
## Jatropha to HRJ (2)



Co-product usage should be linked to the allocation method:

- Mass
- Energy
- Economic value
- Displacement (system expansion)

<b>1</b>	<b>Co-product use:</b>	Electricity
	<b>Allocation:</b>	Energy
<b>2</b>	<b>Co-product use:</b>	Fertilizer
	<b>Allocation:</b>	Displacement
<b>3</b>	<b>Co-product use:</b>	Animal feed, Electricity
	<b>Allocation:</b>	Economic value, Displacement
<b>4</b>	<b>Co-product use:</b>	Electricity
	<b>Allocation:</b>	Displacement



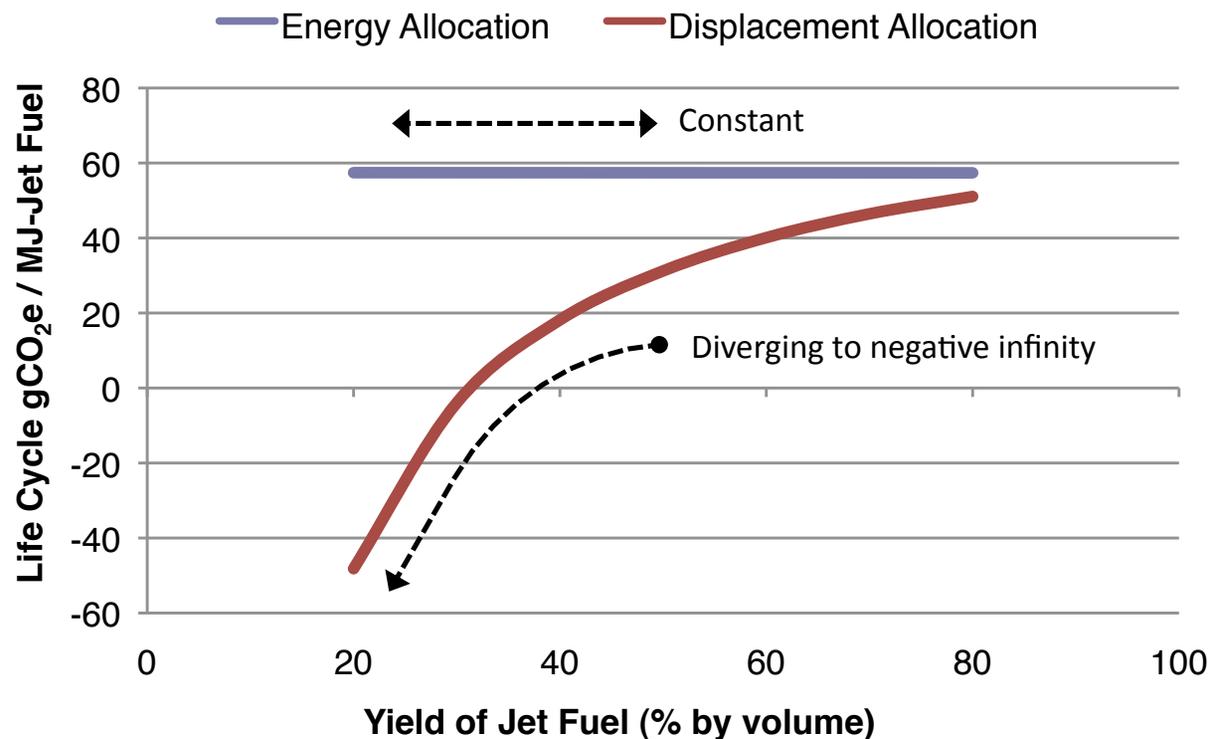
**Subjective allocation and co-product usage choices can be more significant than numerical inputs**

# Co-product Usage and Allocation

## Coal and Biomass F-T Fuel

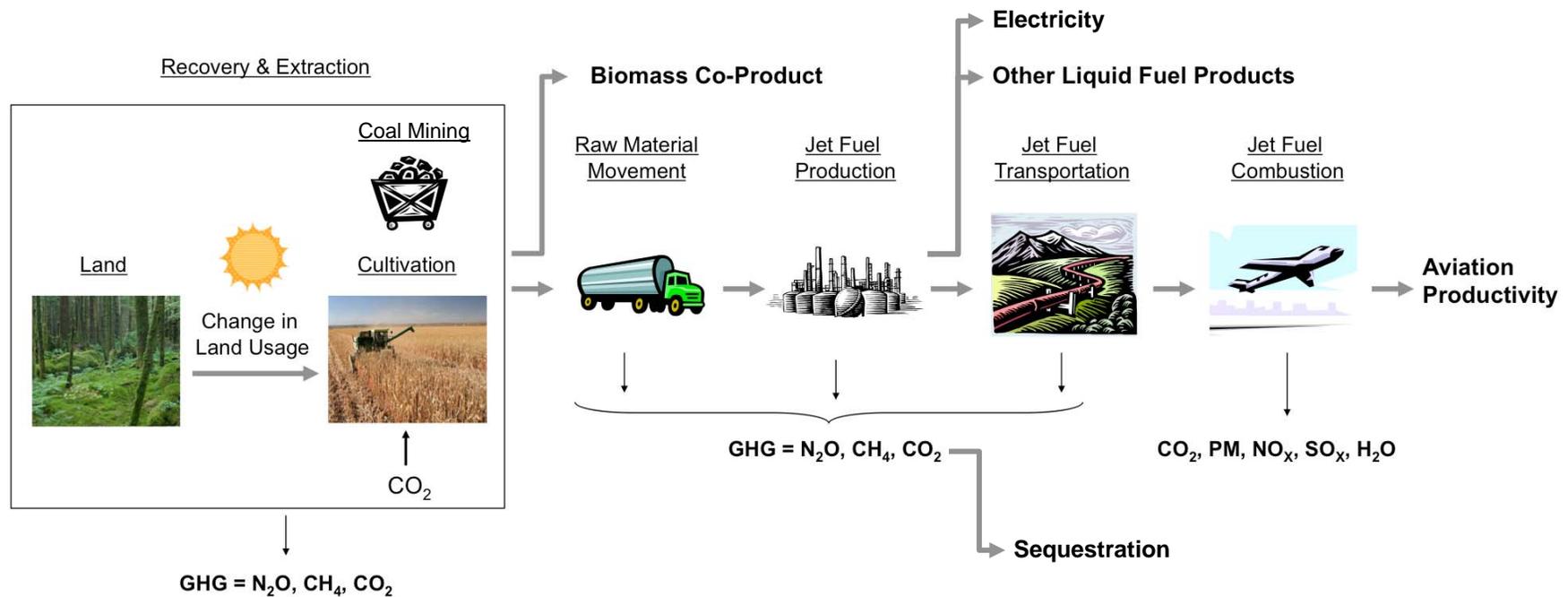


- F-T facility operator has some control over the product slate of diesel, jet, and naphtha
- Displacement allocation makes LC-GHG inventory of F-T jet fuel VERY sensitive to product slate distribution



*Important when product of interest is NOT the primary product, (e.g., jet fuel)*

# Land Use Change (LUC)



- Can be either positive or negative depending on land involved
- Magnitude depends primarily on the type of land being converted to cropland and the type of crops being grown
- LUC can be direct (due to land conversion) or indirect (consequence of a price signal in agricultural products)

# Impact of LUC on Palm HRJ Emissions

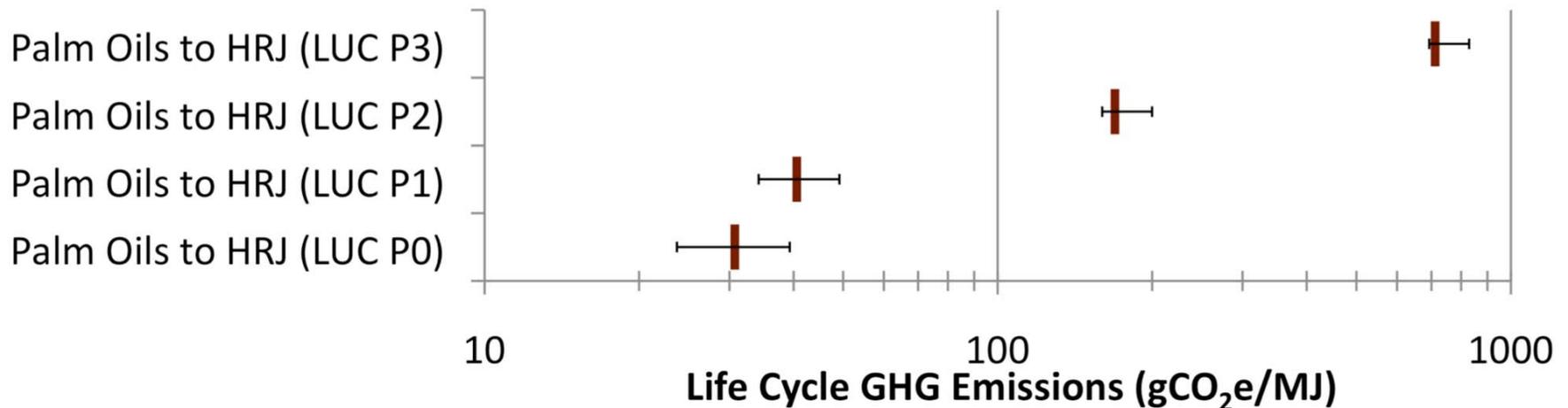


**LUC P0:** No land use change

**LUC P1:** Conversion of logged over forest

**LUC P2:** Conversion of tropical rainforest

**LUC P3:** Conversion of peat land rainforest



- GHG emissions from LUC can dominate a LC-GHG inventory
- Any given feedstock could be subject to different types of LUC
- Independent sets of results under select LUC scenarios used to account for the variability of if and when a fuel pathway may be subject to a particular type of LUC

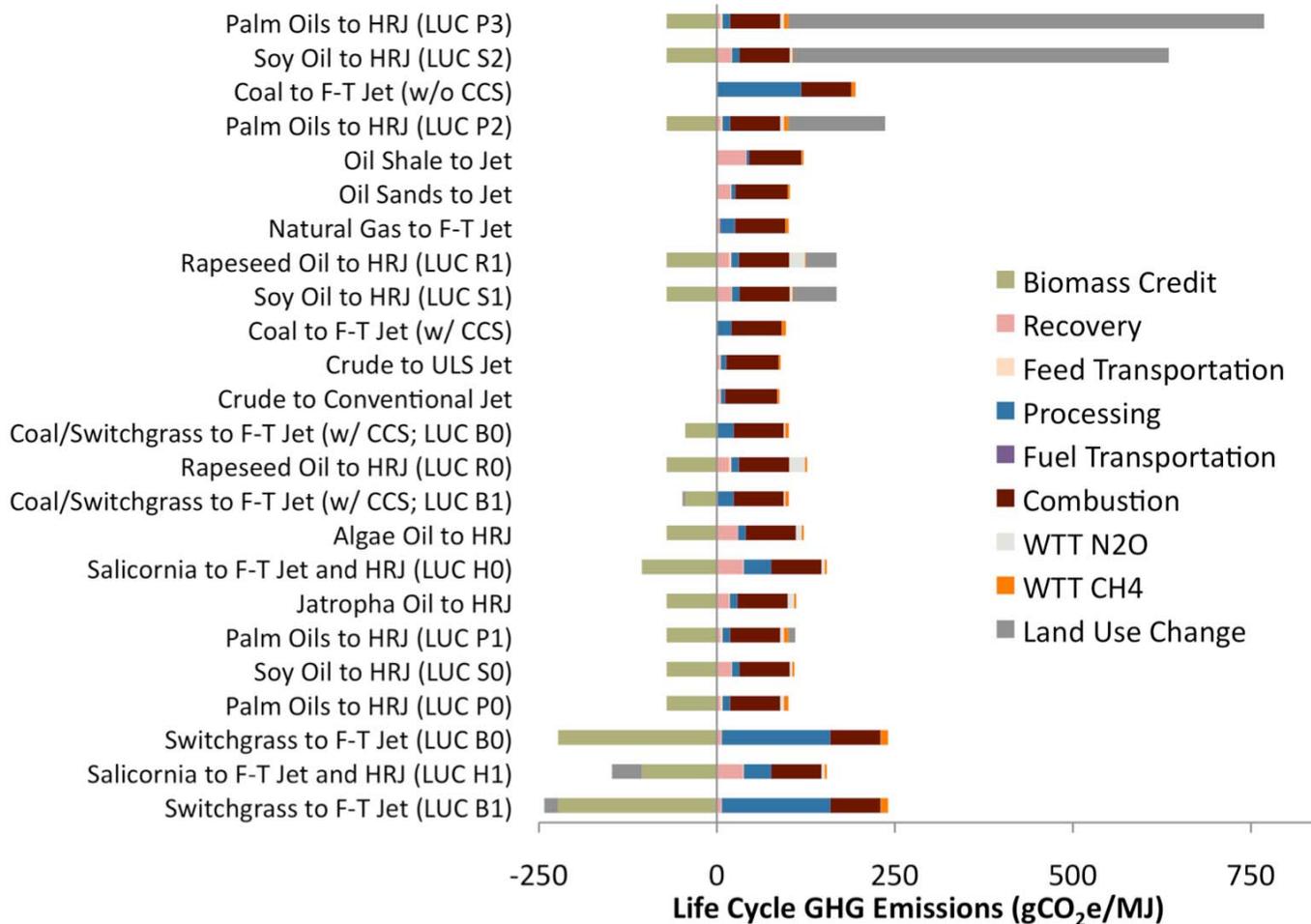
# LUC Scenarios Considered



Land use change	LUC Scenario 1	LUC Scenario 2	LUC Scenario 3
Switchgrass (B0, B1)	Carbon depleted soils converted to switchgrass cultivation	n/a	n/a
Soy oil (S0, S1, S2)	Grassland converted to soybean cultivation	Tropical rainforest converted to soybean cultivation	n/a
Palm oil (P0, P1, P2, P3)	Prev. logged over forest converted to palm plantation	Tropical rainforest converted to palm plantation	Peat land rainforest converted to palm plantation
Rapeseed oil (R0, R1)	Set-aside land converted to rapeseed cultivation	n/a	n/a
Salicornia (H0, H1)	Desert land converted to salicornia cultivation	n/a	n/a

**Note:** In all cases, LUC scenario 0 denotes no land use change

# Comparison of LC GHG Inventories Broken Out by Process



**To reduce GHG emissions, need biofuels created from waste products or from crops that do not incur positive land use changes.**

Soy HRJ Pathway Scenarios	
LUC-S0	No land use change
LUC-S1	Grassland conversion to soybean field
LUC-S2	Tropical rainforest conversion to soybean field
Palm HRJ Pathway Scenarios	
LUC-P0	No land use change
LUC-P1	Logged over forest conversion to palm plantation
LUC-P2	Tropical rainforest conversion to palm plantation
LUC-P3	Peatland rainforest conversion to palm plantation
Rapeseed SPK Pathway Scenarios	
LUC-R0	No land use change
LUC-R1	Set-aside land converted to cultivation
Salicornia SPK Pathway Scenarios	
LUC-H0	No land use change
LUC-H1	Desert converted to salicornia cultivation
Switchgrass to BTL and CBTL	
LUC-B0	No land use change
LUC-B1	Carbon depleted converted to switchgrass cultivation



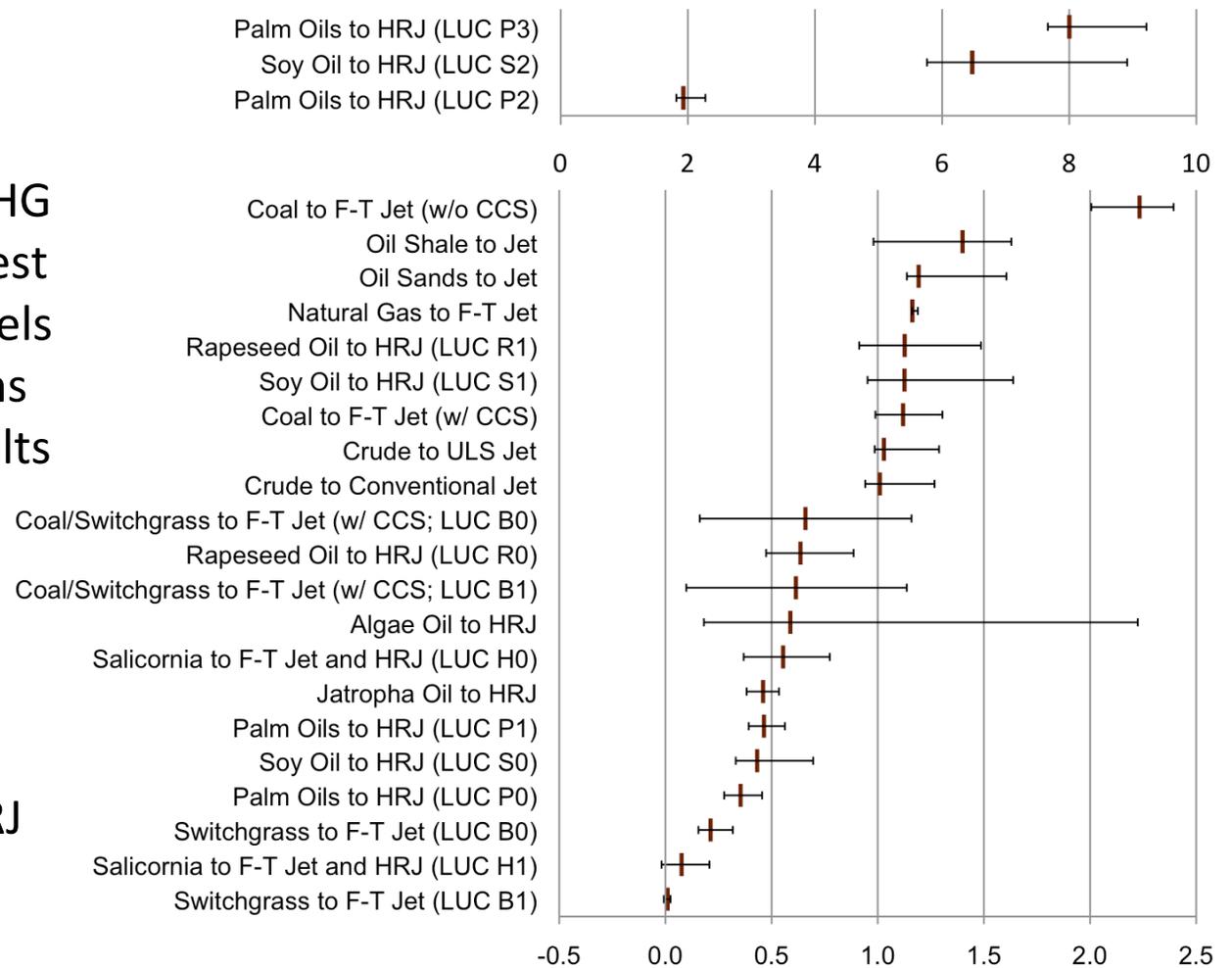
# Comparison of LC GHG Inventories

## Key Points:

- Screening level study
- Large variability
- Few biofuels have zero GHG
- Conv. petroleum has lowest emissions among fossil fuels
- Land use change emissions have large impact on results
- Continuing analysis

## Next to be considered:

- “Sugars” to Jet Fuel
- Pyrolysis oils to Jet Fuel
- Improvement to Algae HRJ



Life Cycle GHG Emissions Normalized by Conventional Jet Fuel  
Does not include non-CO2 combustion impacts

# Challenges in Conducting LCA

## Multiple Metrics



Life cycle GHG emissions are one of many considerations that must be examined when evaluating feasibility and sustainability:

- *Technical feasibility*
- *Environmental impacts on global climate change*
- *Environmental impacts on surface air quality*
- *Efficient usage of fresh water and land resources*
- *Species invasiveness*
- *Economic cost of fuel production*

This research demonstrated challenges of assessing and comparing fuel options using a single attribute.

# Challenges in Conducting LCA

## Key Conclusions



Three key conclusions derive from influence of variability from co-product usage and allocation and LUC assumptions

1. Minimizing variability across LCA results by maximizing methodological consistency is essential to making useful comparisons between fuel options.
2. Absolute results from an attributional LCA may have a diluted physical meaning and are therefore most effective as a comparative tool, given the above condition.
3. To make adequate comparisons, decision makers and general public need to be presented LC-GHG inventories as a range.

Approach emphasizes importance of understanding key aspects that determine LC-GHG emissions.



# Thank you

All results discussed herein are presented in more detail in:

- Stratton, R.W.; Wong, H.M.; Hileman, J.I.; “Quantifying Variability in Life Cycle GHG Inventories of Alternative Middle Distillate Transportation Fuels,” *Environ. Sci. Technol.* **2011**, 45 (10), 4637-4644.
- Stratton, R.W.; Wong, H.M.; Hileman, J.I.; “Life Cycle Greenhouse Gas Emissions from Alternative Jet Fuels,” Partnership for Air Transportation Noise and Emissions Reduction, Massachusetts Institute of Technology: Cambridge, MA, 2010.

**PARTNER Alt Fuels Research: <http://partner.aero> - search for Project 28 to get links to ES&T article and PARTNER Report.**

**Email: [hileman@mit.edu](mailto:hileman@mit.edu)**

# Background and Acknowledgments



- MIT Students: Russ Stratton, Matthew Pearlson, Nick Carter, Michael Bredehoeft, Mark Staples, Kristy Bishop (former), Pearl Donohoo (former), and Hsin Min Wong (former)
- MIT Faculty & Research Staff: Ian Waitz, John Reilly, Sergey Paltsev, Malcolm Weiss, Hakan Olkay, Qudsia Ejaz, Christoph Wollersheim, and James Hileman
- Finishing fifth year of research on alternative jet fuels with funding from FAA, U.S. Air Force, DLA-Energy (PARTNER Projects 17 and 28) and National Academies (ACRP Project 02-07)
- Currently collaborating with:
  - MIT Joint Program on Global Change
  - Argonne National Labs (GREET)
  - U.S. Department of Transportation Volpe Transportation Center
  - Woods Hole Marine Biological Lab
  - Environmental Law Institute
- Cost share partners:
  - DLR, U. of Cambridge, Boeing, Pratt & Whitney, and Shell